ORIGINAL INVESTIGATION



Exome variant prioritization in a large cohort of hearing-impaired individuals indicates *IKZF2* to be associated with non-syndromic hearing loss and guides future research of unsolved cases

Hedwig M. Velde^{1,2} · Maryam Vaseghi-Shanjani³ · Jeroen J. Smits^{1,4} · Gayatri Ramakrishnan⁵ · Jaap Oostrik¹ · Mieke Wesdorp¹ · Galuh Astuti⁶ · Helger G. Yntema^{2,6} · Lies Hoefsloot⁷ · Cris P. Lanting^{1,2} · Martijn A. Huynen⁸ · Anna Lehman³ · Stuart E. Turvey³ · DOOFNL Consortium · Ronald J. E. Pennings^{1,2} · Hannie Kremer^{1,6}

Received: 29 July 2024 / Accepted: 27 September 2024 / Published online: 16 October 2024 © The Author(s) 2024

Abstract

Although more than 140 genes have been associated with non-syndromic hereditary hearing loss (HL), at least half of the cases remain unexplained in medical genetic testing. One reason is that pathogenic variants are located in 'novel' deafness genes. A variant prioritization approach was used to identify novel (candidate) genes for HL. Exome-wide sequencing data were assessed for subjects with presumed hereditary HL that remained unexplained in medical genetic testing by gene-panel analysis. Cases in group AD had presumed autosomal dominantly inherited HL (n = 124), and in group AR, presumed autosomal recessive HL (n = 337). Variants in known and candidate deafness genes were prioritized based on allele frequencies and predicted effects. Selected variants were tested for their co-segregation with HL. Two cases were solved by variants in candidate genes associated with recessive and X-linked HL. Importantly, missense variants in *IKZF2* were found to co-segregate with dominantly inherited non-syndromic HL in three families. These variants specifically affected Zn^{2+} -coordinating cysteine or histidine residues of the zinc finger motifs 2 and 3 of the encoded protein Helios. This finding indicates a complex genotype–phenotype correlation for *IKZF2* defects, as this gene was previously associated with non-syndromic dysfunction of the immune system and ICHAD syndrome, including HL. The designed strategy for variant prioritization revealed that *IKZF2* variants can underlie non-syndromic HL. The large number of candidate genes for HL and variants therein stress the importance of inclusion of family members for variant prioritization.

Introduction

Hereditary hearing loss (HHL) has been the subject of extensive research for decades. In 1950, Kinney asserted that the causes of HHL were still far from being unveiled (Kinney

Hannie Kremer Hannie.Kremer@radboudumc.nl

- ¹ Department of Otorhinolaryngology, Radboudumc, Nijmegen, The Netherlands
- ² Donders Institute for Brain, Cognition and Behaviour, Radboudumc, Nijmegen, The Netherlands
- ³ Department of Pediatrics, The University of British Columbia and BC Children's Hospital, Vancouver, BC, Canada
- ⁴ Department of Clinical Genetics, University Medical Center Utrecht, Utrecht, The Netherlands

1950). At that time, the likelihood of multiple forms of HHL had already been established (Keizer 1952). Until now, our knowledge has expanded to more than 140 genes and over 9000 (likely) pathogenic variants being associated with non-syndromic hearing loss (HL) (Van Camp and Smith)

- ⁵ Department of Medical Biosciences, Radboudumc, Nijmegen, The Netherlands
- ⁶ Department of Human Genetics, Radboudumc, Nijmegen, The Netherlands
- ⁷ Department of Clinical Genetics, Erasmus Medical Center, Rotterdam, The Netherlands
- ⁸ Center for Molecular and Biomolecular Informatics, Radboudumc, Nijmegen, The Netherlands

and a larger number of genes for syndromic HL (Booth and Shearer 2022; McKusick-Nathans Institute of Genetic Medicine n.d.). Despite the significant progress made, the diagnostic yield of genetic analysis through targeted sequencing or exome sequencing targeting a hearing-loss gene panel remains between 25 and 50% (Perry et al. 2023; Sloan-Heggen et al. 2016; Tropitzsch et al. 2022; Zazo Seco et al. 2017). Therefore, a comprehensive insight into the causes of HHL is yet to be attained despite the accomplishments in understanding HHL since Kinney's words.

Knowledge of the specific genetic causes of HL is of great importance. It facilitates accurate prognostic and genetic counselling. Understanding the anticipated progression and eventual degree of HL, as well as the potential manifestation of additional symptoms in the case of a syndromic diagnosis, can be vital for therapeutic management. Also, the identification of the mode of inheritance allows for informed family planning decisions. Importantly, unravelling the hidden genetic landscape of HHL is critical for the development and evaluation of (genetic) therapies as is exemplified by the recent study on gene augmentation therapy for *OTOF*associated HL in humans (Lv et al. 2024).

The reasons for missing genetic diagnoses in diagnostic genetic testing have been extensively discussed (Kremer 2019, 2022). These include limitations of the DNA-sequencing methods and interpretation of identified variants (de Bruijn et al. 2021, 2023). In the present study, we focused on identifying genes that had not yet been associated with HL in humans in a large cohort of subjects with presumed HHL. Clinical exome sequencing and targeted analysis of a deafness gene panel did not unveil the cause of HL in these subjects. Using a variant prioritization approach, a number of potential causative variants in candidate genes for recessively inherited and X-linked HL were identified, and two index cases could be explained by variants in recently identified genes for HL. Importantly, we also found that *IKZF2* is associated with autosomal dominantly inherited HL.

Material and methods

Subject identification

Subjects were recruited from seven academic medical centers in the Netherlands, that collaborate in the DOOFNL consortium: Amsterdam UMC, Erasmus Medical Center, Leiden University Medical Center, Maastricht UMC+, Radboud University Medical Center (Radboudumc, coordinating center), University Medical Center Groningen and UMC Utrecht. Patients were selected for inclusion by their otolaryngologist or clinical geneticist. Subjects were eligible for inclusion if their HL was sensorineural, presumably of genetic origin, and if the most recent gene panel for HL (addressed by exome sequencing), at the time of testing, did not result in a (likely) genetic diagnosis (https://www.radbo udumc.nl/en/patient-care/patient-examinations/exome-seque ncing-diagnostics/exomepanelspreviousversions/exome panelspreviousversions/hearing-impairment, https://www. erasmusmc.nl/nl-nl/patientenzorg/laboratoriumspeciali smen/klinische-genetica#35d085e6-2dc0-48a3-9dfd-8aa50 2ca959e). Patients with an onset of HL after the age of 50 and/or a presumably syndromic form of HL were excluded.

Variant extraction from exome sequencing data

Clinical exome sequencing was performed either in the ISO 15189 accredited Genome Diagnostic Laboratory of the department of Human Genetics at Radboudumc (Haer-Wigman et al. 2017; Velde et al. 2023) or in the ISO 15189 accredited Diagnostic Laboratory of the department of Clinical Genetics at Erasmus MC (Haarman et al. 2022). Initial clinical exome sequencing analysis for included subjects was conducted from 2013 to 2020. In that period, the following enrichment kits were used: Agilent SureSelectXT Human All Exon 50 Mb Kit (Agilent-V4), Agilent SureSelectQXT Human All Exon V5 Kit (Agilent-V5) and Agilent SureSelect Human All Exon V7 Kit (Agilent-V7). For the present study, Variant Call Format (VCF) files were re-annotated using an in-house bioinformatics pipeline (Schobers et al. 2022). As requested by the medical ethics committee, variants in genes that could lead to secondary findings, as indicated by the American College of Medical Genetics and Genomics (ACMG) based on the medical actionability of the associated conditions, were excluded before further analysis in this study (Miller et al. 2021). All other variants were analysed.

Variant prioritization

Two groups were defined for further analyses (Fig. 1). Group AR consisted of index cases with a presumed autosomal recessive inheritance pattern of HL, individuals with an unknown inheritance pattern, and isolated cases. Group AD consisted of index cases with a presumed autosomal dominant inheritance pattern of HL. None of the participating subjects were indicated to suffer from X-linked HL.

As a first step, variants were excluded based on allele frequencies (AF) in the Genome Aggregation Database [gnomAD, v2.1.1 (Karczewski et al. 2020)] and an inhouse database. In group AR, the criterion for exclusion was an AF \ge 1% in either database; in group AD, this was an AF \ge 0.1%.

In the second step, the remaining variants were prioritized based on their predicted effects on the encoded proteins. All variants introducing a stop gain or loss, frameshift variants, (non-)canonical splice site variants (non-canonical splice

Potential study subjects (n = 827)							
Informed consent obtained (n = 461)							
Autosomal recessive inheritance pattern (n = 34)	Unknown inheritance pattern (n = 158)	Autosomal dominant inheritance pattern (n = 124)					
	Group AD (n = 124)						

Fig. 1 Flowchart of subject inclusion and group allocation. AD, autosomal dominant; AR, autosomal recessive

acceptor variants: positions -3 to -20; non-canonical splice donor variants: positions +3 to +8), in-frame deletions or insertions and variants with a predicted effect on splicing by SpliceAI (threshold: $\ge 0.2/1$) (Jaganathan et al. 2019) were included. Missense variants were included if at least one of three in silico tools predicted the variant to be deleterious. Prediction tools and thresholds used in this phase were PhyloP (≥ 2.7) (Pollard et al. 2010), Combined Annotation Dependent Depletion (CADD_PHRED; ≥ 15) (Kircher et al. 2014) and Grantham Score (≥ 80) (Grantham 1974). These tools were incorporated into the in-house bioinformatics pipeline.

As a third step, included variants were prioritized based on internal gene lists of either known human deafness genes or candidate genes (Supplemental Table 1). Four (composite) gene lists were used: (1) human deafness genes [composed of known non-syndromic and syndromic deafness genes based on the Hereditary Hearing Loss Homepage (Van Camp and Smith), literature and OMIM (McKusick-Nathans Institute of Genetic Medicine n.d.)], (2) mouse deafness genes (based on literature, the Mouse Genome Informatics Website (Baldarelli et al. 2021; Blake et al. 2021; Krupke et al. 2017) and personal communication), (3) genes with preferential inner ear expression (Luijendijk et al. 2003; Robertson et al. 1994; Schrauwen et al. 2016) and (4) other candidate genes (based on literature and personal communication). In the AR group, variants in twelve genes with a disproportionately large number of variants were excluded (AHNAK2, ANKRD36, ANKRD36C, CDC27, CTBP2, DNAH7, FAM86B1, MUC21, MUC22, MUC6, NACA and *RRBP1*). These were genes from the list of genes with preferential inner ear expression (Supplemental Table 1, list 3).

For the subsequent step, candidate variants were evaluated separately for the AR and AD groups. In group AR, we selected genes with ≥ 2 variants and thus potentially biallelic variants. We excluded variants in candidate genes (lists 2, 3 and 4) linked to disease in OMIM because pathogenic variants in those genes were more likely to be associated with other conditions, whereas our cohort consisted of individuals with non-syndromic HL. Copy number variants (CNVs) were addressed for genes in specific cases with a strong, *i.e.*, truncating or canonical splice site, monoallelic variant in a known human deafness gene (list 1) or candidate deafness gene (lists 2 and 3). The presence of CNVs was assessed by Copy Number Inference From Exome Reads (CoNIFER (Krumm et al. 2012)) or ExomeDepth (Plagnol et al. 2012), depending on which tool was employed upon clinical exome sequencing for the relevant DNA samples. CNVs were only followed up if the gene was not known to be highly variable in the general population (excluded genes were *MUC17* and *OR2A7*) (Lewis et al. 2022). Genomic qPCR was performed according to standard protocols for putative CNVs to confirm their presence.

In group AD, variants in genes known to be associated with dominantly inherited HL were evaluated as well as variants in orthologs of mouse deafness genes (list 2). To facilitate variant interpretation and follow-up in this group, we focused on variants present in at least three cases. To limit the number of variants to an amount feasible for follow-up, a subgroup of mouse deafness genes (list 2) was used in group AD, based on personal communication and literature (Supplemental Table 1).

In both the AR and AD groups, an additional filtering step was performed for missense variants. Four in silico tools were used with the indicated thresholds: Sorting Intolerant From Tolerant (SIFT; ≤ 0.05) (Ng and Henikoff 2001), Polymorphism Phenotyping v2 (PolyPhen-2; ≥ 0.450) (Adzhubei et al. 2010) and MutationTaster (deleterious) (Schwarz et al. 2014) and again CADD_PHRED (≥ 15). If three or all four of these tools predicted a variant to be non-pathogenic, the variant was excluded. Alignment files (BAM or CRAM, depending on which was available for the relevant DNA samples) were assessed to exclude variants likely to be calling artefacts. In group AR, these files were also used to determine whether variants in close proximity to each other affected the same allele or not.

Variant follow-up

For variants that passed the prioritization steps, clinical files of the relevant cases were reviewed to determine whether a variant had already been evaluated as not causative in clinical exome sequencing. This review also aimed to confirm the presumed inheritance pattern. For variants in known human deafness genes, we also compared the subject's phenotype with the phenotype associated with the relevant deafness gene. Co-segregation with HL in the corresponding families was addressed for variants that passed these steps. Variants were validated by PCR and Sanger sequencing according to standard protocols.

As many family members as necessary and feasible were included to either exclude or confirm co-segregation of the variant with HL. In this process, we considered ethical implications for potentially pre-symptomatic individuals in case of late-onset HL.

Likely causative variants in known human deafness genes, as well as *IKZF2* variants, were classified using the ACMG criteria and its specifications for HL (Oza et al. 2018; Richards et al. 2015).

Characterization of IKZF2-associated HL

To characterize the hearing phenotype, we retrospectively collected audiometric data. Subjects were considered affected when thresholds higher than the age- and sex-specific 95th percentile (International Organization for Standardization, ISO 7029:2017 (International Organization for Stardardization 2017)) were observed in pure tone audiometry for at least three frequencies of the best hearing ear. HL was considered asymmetric if a difference of at least 10 decibel hearing level (dB HL) was observed between both ears at two or more frequencies (Gendeaf Study Group et al. 2003). The pure tone average was defined as the mean of pure tone thresholds at 0.5, 1, 2 and 4 kHz ($PTA_{0.5-4 \text{ kHz}}$). The PTA of the best-hearing ear (better ear PTA) was used for the analyses. Age-related typical audiograms (ARTA) were derived from linear regression analysis of all audiometric data according to previously described methods (Huygen et al. 2003). The right ear of subject III:1 from family W22-1907 was excluded because the HL in that ear was considered unrelated to the IKZF2 variant. In addition, all affected study participants with an IKZF2 variant were requested to complete a questionnaire on audiovestibular function and general medical history. This questionnaire included the dizziness handicap inventory (DHI), consisting of an emotional (E, maximum score of 36), functional (F, maximum score of 36) and physical (P, maximum score of 28) subdomain (Jacobson and Newman 1990; Whitney et al. 2004). If possible, and with permission of the relevant subject, missing data were retrieved from medical records.

VNTR marker analysis

Haplotypes in the *IKZF2* chromosomal region were determined by genotyping variable number of tandem repeat (VNTR) markers as described (Wesdorp et al. 2018).

Protein structural analysis

Missense variants in IKZF2 in two C2H2 domains of the encoded zinc finger (ZF) protein Helios were addressed: Chr2(GRCh37):g.213914526T > G NM_001387220.1:c.485A > C NP_001374149.1:p. (His162Pro) and Chr2(GRCh37):g.213914577C > A NM 001387220.1:c.434G > T NP 001374149.1:p. (Cys145Phe) at the second N-terminal C2H2 domain; and Chr2(GRCh37):g.213914502C > T NM_001387220.1:c.509G > A NP_001374149.1:p.(Cys-170Tyr) at the third N-terminal C2H2 domain. Based on the availability of protein structural data, the impact of missense variants in the second C2H2 domain was investigated using its crystal structure (PDB: 7LPS). For the variant in the third C2H2 domain, reliable structural models from AlphaFold were obtained using default parameters (Jumper et al. 2021; Varadi et al. 2022). To predict and understand the functional outcomes of the missense variants we estimated changes in protein stability brought about by the variants using the FoldX energy function (version 5.0) (Schymkowitz et al. 2005). We first constructed structural models for each missense variant using the RepairPDB and BuildModel functions with five iterations of rotamer adjustments in the amino acid side chains. Subsequently, we calculated the mean differences in protein stability (free energy) between the variant and wild-type (WT) structures, expressed in kcal/mol. A mean difference $(\Delta G_{mut} - \Delta G_{wt})$ of > 1 kcal/mol was classified as destabilizing.

Functional evaluation of IKZF2 variants

Assessment of Helios protein expression and luciferase reporter assays to functionally validate the effect of the three novel *IKZF2* variants were performed as described (Mohajeri et al. 2023) and summarized below. The collaboration between Radboudumc and The University of British Columbia in this study was initiated via GeneMatcher (Sobreira et al. 2015).

Helios expression was assessed by immunoblotting upon transfection of Human Embryonic Kidney (HEK293) cells with 3 µg pCMV6-XL4 plasmids encoding FLAG-tagged WT or variant Helios using LipofectamineTM 3000 Transfection Reagent (Thermo Fisher Scientific). When co-transfection of WT and variant plasmids was performed, a total amount of 3 µg plasmids were employed. Whole cell lysates were separated by 10% SDS-PAGE and transferred onto polyvinylidene difluoride membranes (MilliporeSigma). Prior to SDS-PAGE, protein concentrations were measured using PierceTM Coomassie Plus (Bradford) Assay Reagent. For the detection of FLAG-tagged Helios and β-Actin the employed primary antibodies were the following: anti-Helios, Cell Signaling Technology, cat# 89270, 1:1000, anti-FLAG, Sigma Aldrich, cat# F1804, 1:1000 and anti-β-Actin, Cell Signaling Technology, cat# 3700, 1:20,000. As secondary antibodies, anti-rabbit (IgG DyLight 800, Rockland Immunochemicals) and anti-mouse (IgG IRDye 680RD, LI-COR) were used at a concentration of 1:20,000. The membranes were imaged using a LI-COR Odyssey infrared scanner (LI-COR Biosciences). The bands were quantified using Image StudioTM Lite (LI-COR) and normalized to the corresponding β-Actin expression levels.

For luciferase reporter assays, the -580 to +57 region of the human IL2 promoter was cloned into the PGL4.14 (Promega) firefly luciferase reporter plasmid. Using Lipofectamine 3000 Transfection (Thermo Fisher Scientific), HEK293 cells were co-transfected with the IL2 promotor containing luciferase reporter plasmid, a PGL4.74 (Promega) Renilla luciferase control plasmid and the aforementioned plasmids encoding no (empty vector (EV)), WT or each of the variant Helios. In addition, co-transfections were conducted where cells received a combination of WT and each of the variant IKZF2 plasmids in increasing ratios of variant to WT (0.25:1, 0.5:1, 1:1, 2:1 and 4:1) totalling to 250 ng. Additionally, all cells were also transfected with 250 ng of IL2-luciferase reporter plasmid and 10 ng of PGL4.74 Renilla luciferase control plasmid (Promega). Cells were lysed by adding 1×Glo Lysis Buffer (Promega) and transferred to white flat-bottom 96-well plates in technical triplicates. The Dual-Glo Luciferase Assay Kit (Promega) was used according to manufacturer's recommendations and luciferase activity was measured using the Infinite M200 plate reader (Tecan). In the analysis step, the firefly luciferase activity was normalized against Renilla luciferase. The normalized firefly luciferase activity was further divided by the normalized value from the EV condition.

All data are presented as mean \pm standard error of the mean (SEM). Statistical analysis of Helios quantification on immunoblot was conducted using a parametric one-way ANOVA. This analysis was specifically designed to compare each variant group individually to the WT group. Each row of data represented matched measures, corresponding to results from independently conducted experiments. It is important to note that we did not perform corrections for multiple comparisons in this analysis in order to focus exclusively on the pairwise comparison of each variant group with the WT group, without considering the influence of other groups. This approach allowed for a direct and isolated assessment of the differences between each variant and the WT protein expression levels. Statistical analysis of data

derived from the luciferase reporter assays was conducted using a parametric one-way ANOVA, using Dunnett's test to account for multiple comparisons. Statistical significance is presented as follows: p-val < 0.05 (*), p-val < 0.01 (**), p-val < 0.001 (***) and p-val < 0.0001 (****).

Results

Subject identification and general steps of variant prioritization

A total of 827 subjects were identified as potential study participants and they or their legal representatives were informed about the study (Fig. 1). Written informed consent was obtained from 461 subjects. With only a few exceptions, the individuals enrolled in this study were index cases. For analysis of exome sequencing data, 34 subjects with presumed autosomal recessive inheritance of HL were combined with 145 isolated cases with HL and 158 cases with HL with an unknown inheritance pattern (group AR; n=337). Based on family history, 124 subjects had HL with a presumed autosomal dominant inheritance pattern (group AD).

After AF-based filtering of variants, 900,417 variants remained in group AR and 200,531 in group AD. The average numbers of variants per sample were 2,672 and 1,617 in group AR and AD, respectively. Subsequent filtering of variants using prediction tools yielded 61,180 variants in group AR (average per sample: 182) and 27,089 variants in group AD (average per sample: 218).

Variant prioritization in group AR

Known human deafness genes

In group AR, 2247 variants were identified in known human deafness genes (Supplemental Table 1, list 1; Supplemental Table 2). Variants in samples without a second variant in the same gene were excluded, after which 315 variants remained. Hemizygous variants on the X chromosome were included. For follow-up feasibility, the most promising variants were targeted through an additional filtering step, specifically selecting samples in which at least one of the variants was predicted to have a truncating effect. This revealed 102 variants, of which 92 were excluded after manual assessment of alignment files. Most of the excluded variants were found in older files or involved contiguous nucleotides. Of the remaining ten variants, four were excluded because the phenotype of the subjects did not match the phenotype reported in the literature, and one was excluded because the case had already been solved (Chen et al. 2021) but was not correctly removed from the cohort of unsolved cases (Supplemental Table 3). Five variants, of which one in homozygous state, were selected for follow-up (Table 1).A homozygous truncating *ABHD12* variant (ACMG classification 'pathogenic': PVS1, PM2, PM3_supp, PP3, PP4) was the likely cause of HL in the subject. *ABHD12* is associated with a combination of HL, polyneuropathy, ataxia, retinitis pigmentosa and cataracts (OMIM 612674). Upon review of the subject's clinical records, the presence of cataracts in addition to moderate-to-severe HL since childhood (Supplemental Fig. 2A) was noted. Besides the *ABHD12* variant, four *LRP2* variants were selected for follow-up. These four variants were identified in one subject and did not cosegregate with HL in the family.

Candidate genes

After exclusion of variants in twelve genes with a disproportionately high number of variants, 13,033 variants were identified in candidate genes (Supplemental Table 1, lists 2, 3 and 4; Supplemental Table 4). Selection of variants that were potentially bi-allelic revealed 2228 variants. Because the study population consisted of individuals with non-syndromic HL or, at least, without other major health issues, variants in genes associated with other phenotypes in OMIM were excluded. After this step, 1323 variants remained. By using additional in silico prediction tools (CADD PHRED, SIFT, PolyPhen-2 and MutationTaster) and manually assessing alignment files, 735 and 546 variants were excluded, respectively (again mainly in older files and contiguous nucleotides). Of the remaining 42 variants, four variants were excluded because the subjects decided to withdraw from the study, six because reassessment of clinical information revealed that the cause of HL was unlikely to be

genetic and six because the case was solved after inclusion (Supplemental Table 3). Twenty-five variants, of which six in hemizygous state, were selected for follow-up (Table 2; Supplemental Table 5).

Variants in ANKRD17, ELK1, ENOX2, HEPH, SHPRH, SRPX and YIPF6 were considered to be possibly causative to the HL in the relevant subjects (Table 2). For the ANKRD17, ELK1, ENOX2, and YIPF6 variants, no segregation analysis was possible, e.g. due to the absence of siblings or the unwillingness of relatives to participate. For variants in HEPH, SHPRH, and SRPX, only limited segregation analysis could be performed, and there were no other subjects with candidate variants in these genes. A hemizygous variant in the X-linked gene HEPH was confirmed to be inherited from the unaffected mother of the index case. No other relatives were available for segregation analysis. For the index case with two SHPRH variants and mild-to-moderate down-sloping HL in childhood, it was confirmed that these were present in trans. However, the absence of siblings precluded further segregation analysis. An unaffected brother of the index case with a hemizygous SRPX variant did not have the variant.

So far, there is no additional support for the association with HL for these seven genes with potentially causative variants, neither from mouse variants (IMPC, http:// mousephenotype.org (Groza et al. 2023)), MGI (Baldarelli et al. 2024), or literature) nor from direct interactions of the encoded proteins with proteins known to be critical for hearing (STRING database (Szklarczyk et al. 2023)). The remaining candidate variants were excluded because they did not co-segregate with HL, were present *in cis*, or were not validated by PCR and Sanger sequencing (Supplemental Table 5).

Table 1 Follow-up of selected variants in human deafness	Gene	Variant	Findings ^a
genes in group AR	ABHD12	Chr20(GRCh37):g.25282937del NM_001042472.3:c.1075del p.(Val359Phefs*27) (homozygous)	Likely cause of HL, no segregation analysis possible Gene not yet in HL gene panel for
			clinical exome sequencing
	LRP2	Chr2(GRCh37):g.170002322G > A NM_004525.3:c.12923C > T p.(Thr4308Met)	Variants do not co-segregate with HL
		Chr2(GRCh37):g.170070387G > T NM_004525.3:c.5827-7C > A p.?	
		Chr2(GRCh37):g.170081863G>T NM_004525.3:c.5495C>A p.(Ser1832*)	
		Chr2(GRCh37):g.170081873C>A NM_004525.3:c.5485G>T p.(Asp1829Tyr)	

Variants are in heterozygous state unless stated otherwise

^aOne cell per subject

Table 2 Possibly causative variants in candidate deafness genes in group AR

Gene	Variant	Findings ^a
ANKRD17	Chr4(GRCh37):g.74027206T > C NM_032217.5:c.548-141A > G p.? (homozygous)	Possibly causative, no segregation analysis possible
ELK1	ChrX(GRCh37):g.47497233G > A NM_001114123.3:c.1003C > T p.(Arg335Trp) (hemizygous)	Possibly causative, no segregation analysis possible
ENOX2	ChrX(GRCh37):g.129822965G > A NM_182314.3:c.212C > T p.(Thr71Ile) (hemizygous)	Possibly causative, no segregation analysis possible
HEPH	ChrX(GRCh37):g.65427064G>T NM_138737.4:c.2481G>T p.(Lys827Asn) (hemizygous)	Possibly causative, no further segregation analysis possible
SHPRH	Chr6(GRCh37):g.146244887A > G NM_001370327.1:c.3437 T > C p.(Ile1146Thr) Chr6(GRCh37):g.146271582 T > G NM_001042683.1:c.800A > C p.(Glu267Ala)	Possibly causative, no further segregation analysis possible
SRPX	ChrX(GRCh37):g.38009034A>G NM_006307.5:c.1325 T>C p.(Ile442Thr) (hemizygous)	Possibly causative, no further segregation analysis possible
YIPF6	ChrX(GRCh37):g.67733173G>A NM_001195214.2:c.62G>A p.(Arg21His) (hemizygous)	Possibly causative, no segregation analysis possible

Variants are in heterozygous state unless stated otherwise ^aOne cell per subject

CNV analysis

Eighty-one monoallelic truncating variants were identified in human deafness genes (Supplemental Table 1, list 1: (non-)syndromic deafness genes) and 581 in candidate deafness genes (Supplemental Table 1, lists 2, 3 and 4) (Supplemental Table 6). These were further addressed if CNV analysis (CoNIFER or ExomeDepth) was performed in clinical exome sequencing. In two samples, a CNV was called in the human deafness gene in which the truncating variant was identified and in twelve samples this was the case for candidate deafness genes. Six of the latter samples were excluded because the gene in which the CNV was called (MUC17, OR2A7), was known to be highly variable (Lewis et al. 2022). In total, eight samples were selected for confirmation of the CNV by genomic qPCR (Supplemental Table 7). Only a deletion in MGAM could be confirmed. This deletion was identified in two index cases who harboured the same truncating MGAM variant. Segregation analysis for one of the subjects demonstrated that the truncating variant and the deletion were located on the same allele.

Variant prioritization in group AD

Known human deafness genes

Initially, we identified 91 variants in known human deafness genes in group AD (Supplemental Table 8). Twenty missense variants were excluded based on evaluations by four in silico prediction tools (CADD PHRED, SIFT, Poly-Phen-2 and MutationTaster). Additionally, 18 variants were excluded as they had previously been identified in clinical exome sequencing analyses and could either not be validated (n=7) or were proven to be non-causal, for example, through segregation analysis (n = 11). Of the remaining 53 variants, 36 were selected for further evaluation based on assessment of alignment files. Subsequently, 29 of these were excluded after phenotype and variant type comparison with the literature (n = 19) or validation of the inheritance pattern (n=5), using updated MutationTaster predictions (MutationTaster2021 (Steinhaus et al. 2021) (n = 5), or because of insufficient phenotypic information about the subject (Supplemental Table 9). Two variants were excluded for two reasons. Ultimately, seven variants were selected for

Mouse deafness genes

A total of 787 variants in orthologs of mouse deafness genes were identified, 490 of which were in genes with variants present in at least three samples (Supplemental Table 11). A subgroup of mouse deafness genes was used to select the most promising variants (Supplemental Table 1), resulting in 33 candidate variants. Eighteen of these were excluded upon assessment of alignment files. Fifteen variants in five different genes were selected for follow-up of which only two variants in *IKZF2* remained as strong candidates (Supplemental Table 12; Table 3). These two variants affect highly conserved cysteine or histidine residues in ZF motifs of the encoded protein Helios (Fig. 2).

IKZF2 has been shown to be crucial for the functional maturation of outer hair cells in mice and, consequently, for hearing (Chessum et al. 2018). This gene encodes Helios, a member of the Ikaros ZF transcription factor family, typically with four ZF motifs in the N-terminal region of the protein and two in the C-terminal region (Fig. 2, Mohajeri et al. 2023).

Further assessment of candidate gene IKZF2

Evaluation of IKZF2 variants in additional exomes

To strengthen the findings for *IKZF2*, variants in this gene were assessed in unresolved cases with presumed HHL who underwent clinical exome sequencing after the initiation of the present study. This revealed two additional rare missense variants. The first variant was derived from the affected father (family W22-2757) and, interestingly, also affects a zinc-binding residue in a ZF motif of Helios (Fig. 2, Table 3). Consequently, this variant was included for further assessment. The second variant, Chr2(GRCh37):g.213872179G > A NM_001387220.1:c.1486C > T p.(Arg496Trp), did not cosegregate with HL in the family.

The identified IKZF2 variants

The three variants in IKZF2 to be further addressed Chr2(GRCh37):g.213914526 T > Gwere NM_001387220.1:c.485A>C NP_001374149.1:p. (His162Pro) (ACMG classification 'likely pathogenic': PS2_supp, PS3_supp, PM2, PP3) in family W16-0482, Chr2(GRCh37):g.213914502C>T NM_001387220.1:c.509G>A NP_001374149.1:p. (Cys170Tyr) (ACMG classification 'likely pathogenic': PS3_supp, PM2, PP1_mod, PP3) in family W22-1907 and Chr2(GRCh37):g.213914577C>A NM_001387220.1:c.434G>T NP_001374149.1:p. (Cys145Phe) (ACMG classification 'unknown significance': PS3 supp, PM2, PP1, PP3) in family W22-2757 (Fig. 3, Table 3; Supplemental Fig. 1). All three variants were

Table 3	Overview	of IKZE2	variants
Iable J		$01 I M L I^2 L$	variants

Family	Variant GRCh37 (hg19) NM_001387220.1	Effect on protein NP_001374149.1	GnomAD minor allele frequency (%)	Variant classification ^a	CADD_ PHRED	SIFT	PolyPhen-2	Mutation Taster
W16-0482	Chr2:g.213914526T>G c.485A>C	p.(His162Pro)	0.0004/0.003 (other/ non-Finnish European)	Likely pathogenic (PS2_supp, PS3_ supp, PM2, PP3)	24.6	0.00	0.998	Deleterious
W22-1907	Chr2:g.213914502C>T c.509G>A	p.(Cys170Tyr)	-	Likely pathogenic (PS3_supp, PM2, PP1_mod, PP3)	29.4	0.01	0.998	Deleterious
W22-2757	Chr2:g.213914577C>A c.434G>T	p.(Cys145Phe)	_	Unknown signifi- cance (PS3_supp, PM2, PP1, PP3)	32.0	0.86	0.998	Deleterious

^aVariant classification was performed using the American College of Medical Genetics and Genomics Standards and Guidelines (Oza et al. 2018; Richards et al. 2015). CADD, Combined Annotation Dependent Depletion, threshold value \geq 15 (Kircher et al. 2014); GnomAD, Genome Aggregation Database (version 2.1.1), total population exome frequency / maximum exome frequency (corresponding population); Mutation-Taster, threshold value 'deleterious' (Schwarz et al. 2014); PolyPhen-2, Polymorphism Phenotyping v2, threshold value \geq 0.450 (Adzhubei et al. 2010); SIFT, Sorting Intolerant From Tolerant, threshold value \leq 0.05 (Ng and Henikoff 2001); –, not present in database



Fig. 2 Schematic representation of the Helios protein and its functional domains. Adapted and updated version of a previously published figure by Mohajeri et al. (2023). The variants reported in this study are shown above the protein, while previously reported variants are displayed below the protein. The underlined variant was found to by present homozygously. Grey arrows indicate missense variants, and black arrows indicate stop gain variants. The legend for the symbols used is provided within the figure: 'Hearing loss' signifies

predicted to be deleterious by either three or all four of the used in silico tools and were either absent in gnomAD (version 2.1.1) or present only at a frequency < 0.01% (Table 3).

None of the variants were predicted to impact splicing according to SpliceAI. In line with the ACMG Standards and Guidelines and its specifications for hearing loss (Oza et al. 2018; Richards et al. 2015), intended for diagnostic use, all three variants were classified as variants of unknown significance. Interestingly, each of these three missense variants impacts one of the four critical amino acid residues for Zn-binding, i.e., cysteine or histidine. These are arranged in a highly conserved Cys2-His2 (C2H2) ZF motif, of which the ZF protein Helios contains six, interspersed by disordered regions. Four N-terminal domains are DNA-binding, and two C-terminal domains are protein interaction domains (Powell et al. 2019). Specifically, the p.(Cys145Phe) and p.(His162Pro) variants affect the second N-terminal ZF motif and the p.(Cys170Tyr) variant affects the third N-terminal ZF motif (Fig. 2).

Segregation analyses of IKZF2 variants

To confirm the association of *IKZF2* variants with the HL in the families, relatives were included in the study.

non-syndromic hearing loss and pertains to the subjects in this study; 'Immune abnormality' refers to variants associated with immune deficiency or dysregulation (Hetemäki et al. 2021; Mayr et al. 2022; Shahin et al. 2022); and 'Multiple symptoms' indicates syndromic disease, including both hearing loss and immune abnormalities, referencing two patients described by Mohajeri et al. (2023). Exon numbers are according to the reference sequence NM_001387220.1. ZF, zinc-finger motif

The index case (III:2) in family W16-0482 (Fig. 3A) inherited the c.485A>C p.(His162Pro) variant from her affected father (II:2), unlike her two unaffected brothers. The variant was not identified in two paternal aunts (subjects II:1 and II:4) of the index case, both of whom exhibited bilateral SNHL. However, with a better ear PTA_{0.5-4 kHz} 25 dB HL (II:1) and 39 dB HL (II:4), respectively, their HL was markedly milder than that of their brother (II:2, 75 dB HL) and his daughter (III:2; 38 dB HL at 26 years of age) who both had the variant. (Fig. 4, Supplemental Fig. 2, Supplemental Table 13). Therefore, we hypothesized that SNHL in this family was genetically heterogeneous. VNTR marker analysis revealed that subjects II:2 and II:4 shared the same genotype for markers flanking IKZF2 despite the discordance in the nucleotide at position c.485 (Supplemental Fig. 3). The latter was confirmed by sequencing two different amplicons of the relevant exon to rule out that only the WT allele was amplified for subject II:4. These results suggest that the IKZF2 variant occurred de novo in subject II:2. To explore other potential causes of HL in all affected family members, exome sequencing was performed for subjects II:1, II:2, III:1 and III:2 using the same exome enrichment kit and sequencing platform. Variants in known deafness genes (list 1) as well as in candidate deafness genes (lists 2, 3 and, 4) present in subjects II:1, II:2 and III:2, but absent in subject III:1,

were assessed but did not yield an alternative explanation for the HL. The reported age of onset of subject II:2, was 45 years, and that of subject III:2 15 years. Only subject II:2 completed the questionnaire, he described the HL as progressive, and the DHI score was 0, indicating no-to-mild vestibular dysfunction.

For family W22-1907, seven relatives of the proband (III:2) participated in this study (Fig. 3B). All four relatives (II:3, II:4, III:1, III:3) with bilateral SNHL, and none of the three subjects with normal hearing (II:1 (Supplemental Fig. 2), II:2 and III:4), were found to be heterozygous for the c.509G>A p.(Cys170Tyr) variant. Better ear PTA_{0 5-4 kHz} ranged from 29 to 30 dB HL for subjects in generation III (aged 25-34), while those for subjects in generation II (aged 53 and 62) were 45 and 70 dB HL, respectively (Fig. 4, Supplemental Table 13). Only subject III:1 had a considerably asymmetrical, progressive HL with hearing thresholds of 29 dB HL in the left ear and a functionally deaf ear on the right (118 dB HL). Since the HL in the right ear manifested much earlier than that in the left ear, and given the greater severity of the HL in the right ear compared to both the left ear and other subjects, the HL in subject III:1's right ear was considered unrelated to the IKZF2 variant. Medical examinations failed to explain the severe HL in this subject's right ear. Specifically, there was no history of meningitis or head trauma, and otoscopy and CT imaging did not reveal any (anatomic) abnormalities, except for a choanal atresia on the left side, which was deemed to be unrelated. No MRI had been performed. The reported age of onset was 12 (II:3), 18 (II:4), in childhood (III:1, III:2), and in adolescence (III:3) and the HL was progressive (Table 4). The available DHI scores were 0 (II:4), 2 (III:1), 8 (II:3) and 14 (III:2), all indicating no-to-mild vestibular dysfunction.

For family W22-2757, two affected relatives of the proband (III:2) were included in this study, and three with normal hearing (Fig. 3C). Genotyping confirmed co-segregation of the c.434G>T p.(Cys145Phe) variant with HL in the family. The proband inherited the variant from her father (II:2), and both subjects had bilateral, symmetrical SNHL (Fig. 4). For the proband, the better ear PTA_{0.5-4 kHz} was 36 dB HL at the age of 36, while that of her father (II:2, age 59) was 38 dB HL (Supplemental Table 10). The variant was also identified in her affected cousin, with a better ear PTA_{0.5-4 kHz} of 36 dB HL at the age of 40. The reported ages of onset were 3–4 years (III:1), 20–25 years (III:2) and 32 years (II:2). All subjects reported progressive HL. Subject II:2 completed the DHI questionnaire and scored 0, indicating no-to-mild vestibular dysfunction.

The mean difference in $PTA_{0.5-4 \text{ kHz}}$ between the better and worse ears for all affected subjects was 4 dB HL, except for subject III:1 from family W22-1907 with asymmetrical HL. None of the subjects with HL and variants in *IKZF2* nor

Family	Subject	Sex	Age ^a (years)	Age of HL onset ^b	Progression ^c	Use of hearing aids	Risk factors for acquired HL	DHI	Other
W16-0482	II:2	М	56	45 years	Yes	Yes	Antibiotic use ^d ; noise exposure	0	Tinnitus; positive family anamnesis for rheu- matism
	III:2	F	N/a	15 years	MD	MD	MD	MD	
W22-1907	II:3	F	62	12 years	Yes	Yes	Recurrent ear infections	8	Tinnitus; symptoms of vertigo
	II:4	М	53	18 years	Yes	Yes		0	
	III:1	М	39	Childhood	Yes	No	Ear surgery (tubes); recurrent ear infec- tions	2	Tinnitus; medical history of congenital choanal atresia on the left side
	III:2	F	38	Childhood	Yes	No	Antibiotic use; ear surgery (tubes)	14	
	III:3	М	36	Adolescence	Yes	No	MD	MD	
W22-2757	II:2	М	59	32 years	Yes	Yes		0	
	III:1	F	43	3-4 years	Yes	MD	MD	MD	
	III:2	F	38	20-25 years	Yes	Yes	MD	MD	

Table 4 Results of questionnaires and assessment of medical records in affected subjects with IKZF2 variants

DHI, dizziness handicap inventory; F, female; HL, hearing loss; M, male; MD, missing data (applicable to retrospective assessment of medical records in case of uncompleted questionnaires); N/a, not applicable; y, years

^aAge at completing questionnaire (not applicable in case of data retrieval from medical records)

^bSelf-reported age of onset

^cSelf-reported progression

^dType of which unknown



Fig. 3 Pedigrees of families W16-0482, W22-1907 and W22-2757 and co-segregation of the identified *IKZF2* variants with HL. The clinical status of the individuals is indicated by the filling of the symbols: black indicates that the subject has HL, and white indicates that the subject has no HL. The clinical status is based on audiograms in all subjects marked with an asterisk. **A** Family W16-0482. V: c.485A>C p.(His162Pro). Subjects II:1 and II:4 (marked

their affected relatives reported symptoms of other medical conditions.

Protein structural analysis

Based on structural data, the two missense variants c.485A>C p.(His162Pro) and c.434G>T p.(Cys145Phe) were found to be located at the zinc ion (Zn²⁺) coordination site of the second N-terminal Zn finger (Fig. 5A). The primary role of Zn⁺² ions is to impart structural stability. Structural modelling of the two variants suggests considerable protein destabilization due to disruption of Zn²⁺ coordination: $\Delta\Delta G_{mut-wt}$ His162Pro = 6.88 kcal/mol, $\Delta\Delta G_{mut-wt}$ Cys145Phe = 6.62 kcal/mol. Both variants

with a hashtag) did have HL, but a significantly milder phenotype than other affected family members. The variant (V) was found to be de novo in II:2 (Supplemental Fig. 2). **B** Family W22-1907. V: c.509G>A p.(Cys170Tyr). **C** Family W22-2757. V: c.434G>T p.(Cys145Phe).+, wildtype; square, male; circle, female; slash through symbol, deceased; arrow, proband

are anticipated to cause loss of helical structural integrity as proline (c.485A>C p.(His162Pro)) can neither form a helix nor interact with Zn^{2+} , and phenylalanine (c.434G>T p.(Cys145Phe)) loses Zn^{2+} coordination due to the aromatic and hydrophobic side chains of Phe145 (Fig. 5B, C, variants in grey sticks). Both missense variants are thus predicted to disrupt protein folding, thereby affecting protein function. Furthermore, we assessed variant c.509G>A p.(Cys170Tyr) present in the third N-terminal C2H2 domain in a similar manner. Structural superposition of the modelled structure of the third C2H2 domain onto the second C2H2 domain, indicated the presence of the variant at the Zn^{2+} coordination site marked by Cys170, Cys173, His186, and His190 (Fig. 5D). The substitution of Cys170 to a bulky



Fig. 4 Audiological features of subjects with *IKZF2* variants. The first ten panels show the pure tone air conduction thresholds in dB HL of 0.25–8 kHz of subjects identified with an *IKZF2* variant (c.485A>C p.(His162Pro) in family W16-0482; c.509G>A p.(Cys170Tyr) in family W22-1907; c.434G>T p.(Cys145Phe) in family W22-2757) from whom audiometric data was available. Black lines with circles represent the right ear, black lines with crosses rep-

resent the left ear, grey lines and dots represent the age- and genderspecific 95th percentile. The last panel shows the age-related typical audiograms (ARTA), derived from cross-sectional linear regression analysis of the most recent audiograms of individuals identified with *IKZF2* variants. Each blue line represents a ten-year age span. dB HL, decibel hearing level; F, female; kHz, kilo Hertz; M, male; y, years



Fig. 5 Structural modeling of *IKZF2* variants. **A** Crystal structure of the second N-terminal C2H2 domain (PDB: 7LPS) is illustrated, with the variant positions of interest His162 and Cys145 highlighted in sticks at the Zn⁺² coordination site. Atomic distances shown are in angstroms (Å). Missense variants c.485A>C p.(His162Pro) and c.434G>T p.(Cys145Phe) represented as grey sticks are depicted in (**B**, **C**), respectively. **D** The third variant position of interest, Cys170, is located at the third N-terminal C2H2 domains Zn⁺² coordination

and aromatic tyrosine is expected to disrupt the structural integrity of Helios as well, through steric clashes (Fig. 5E), resulting in the loss of ability to bind Zn^{2+} , $\Delta G_{mut} - \Delta G_{wt}$ Cys170Tyr = 10.75 kcal/mol. The structural analyses of the three missense variants are thus suggestive of deleterious functional outcomes through misfolded C2H2 domains.

Functional evaluation of IKZF2 variants

To assess the effect of the amino acid substitutions on Helios expression, HEK293 cells, which lack basal expression of Helios, were transfected with p.CMV6-XL4 plasmids encoding FLAG-tagged WT or either of the three variant Helios proteins. Additionally, considering the heterozygous nature of the variants in the patients, we aimed to mimic the in vivo conditions more closely and assess whether the WT and variant forms of Helios have synergistic, antagonistic, or independent effects on each other's expression in the cellular environment. To achieve this, cells were co-transfected with equal proportions of the WT and each variant IKZF2 plasmid. An EV was used as a negative control. In Western blot analysis, all three Helios variants, when expressed individually, demonstrated significantly lower expression levels than WT Helios (Fig. 6A). This indicates an impact of the amino acid substitutions on protein synthesis and/or stability. In

site, as depicted. The figure shows superposition of the modelled structue of the third C2H2 domain (yellow, with side chains optimized) onto the second C2H2 domain (light red) cocrystallized with Zn⁺². **E** The missense variant c.509G>A p.(Cys170Tyr) is predicted to cause steric clashes in its neighbourhood, indicated by the nonbonded distances that are less than the sum of their van der Waals radii (<1.8 Å)

contrast, cells co-transfected with WT and each respective variant plasmid exhibited a reduction in expression relative to WT alone; however, this reduction was not statistically significant (Fig. 6A).

To study the functional impact of the variants, we employed a well-established luciferase reporter assay that has previously been used to demonstrate a dominant-negative effect of variants in IKZF2 (Mohajeri et al. 2023). In this assay, HEK293 cells were co-transfected with a firefly luciferase reporter plasmid harbouring the -580to + 57 region of the human IL2 promoter, which includes the Helios DNA binding consensus sequence, along with either EV, WT, or variant IKZF2 plasmids. Results indicated that each variant significantly reduced the ability to repress transcription from the IL2 promoter when compared to WT. This reduction was statistically significant for all three variants. In the co-transfection assays with ratios of 0.25:1, 0.5:1 and 1:1 variant to WT plasmids, no significant difference was observed in IL2 repression when compared to WT alone (Fig. 6B). However, at ratios of 2:1 and higher, there was a notable decrease in suppressive activity, as evidenced by an S-shaped curve in the graphical representation (Fig. 6B), suggesting a compromised ability to suppress IL2 expression at these higher variantto-WT ratios.



∢Fig. 6 Functional evaluation of the identified *IKZF2* variants. Variant c.485A>C p.(His162Pro) in family W16-0482, variant c.509G>A p.(Cys170Tyr) in family W22-1907 and variant c.434G>T p.(Cys145Phe) in family W22-2757. A Assessment of variant protein expression in HEK293 cells. Immunoblot analysis of cells transfected with plasmids coding for 3xFLAG-tagged WT Helios or Helios with the amino acid substitutions alone, or a combination of WT and variant plasmids. There is a statistically significant decrease in Helios protein levels when the variants are expressed alone but no significant decrease when the Helios variants are co-expressed with WT Helios (right panel). A parametric one-way ANOVA was used for statistical analysis: *p < 0.05; **p < 0.01. **B** Luciferase reporter assays to assess the variants' ability to repress IL2 promotor activity, demonstrating statistically significant decrease in repression of the IL2 promotor by the variant Helios proteins when expressed alone. Upon co-expression of WT and variant Helios in increasing ratios of transfected variant plasmids, a statistically significant decrease of IL2 promoter repression is only observed for ratios of 2:1 and higher. A parametric one-way ANOVA was used for statistical analysis: p < 0.05; ***p*<0.01; ****p*<0.001; *****p*<0.0001. EV, empty vector control; IL2, interleukin-2; ns, not statistically significant; WT, wildtype

Discussion

In this study, exome sequencing data were assessed to identify the causes of HL in a cohort of 461 index cases with presumably non-syndromic hereditary SNHL and an onset before the age of 50. These index cases remained unsolved after medical genetic testing by clinical exome sequencing combined with targeted gene panel analysis for HL between 2013 and 2020. The main goal of the study was to identify novel genes for HL by designing a strategy to prioritize DNA-variants in candidate genes for further analysis. However, the first step in the analysis was to address variants in genes of the most recent gene panel (354 genes, list 1) because the number of genes associated with HL significantly increased since 2013 (Hearing Impairment Gene Panel DGD181213, containing 102 genes).

The designed strategy and follow-up of variants resulted in a (likely or potential) genetic diagnosis for five families. These represent 1.1% of the index cases in our total cohort, 3.2% in the AD group and 0.3% in the AR group. A single novel gene for non-syndromic HL was identified, IKZF2, with missense variants co-segregating with autosomal dominantly inherited HL in three families. The outcome of the analysis strategy did not meet our expectations, especially for the AR group. There are several potential explanations for this limited number of diagnoses. Obviously, causative variants affecting intronic and/or regulatory regions of genes or regions with insufficient sequencing coverage were lacking from the data. The latter is expected to be more common in the oldest exome sequencing data. Furthermore, CNV detection in exome sequencing data is not optimal, which is even more the case for other types of structural variants (SVs) (de Bruijn et al. 2021; Porubsky and Eichler 2024). Targeted analyses using genome sequencing or other

techniques, mainly applied for monoallelic cases, have already demonstrated the occurrence of pathogenic SVs, e.g., in USH2A and PCDH15 (Reurink et al. 2023; Vaché et al. 2020). For STRC and OTOA, with neighbouring pseudogenes, SVs are the most prominent pathogenic variants (Domínguez-Ruiz et al. 2023; Laurent et al. 2021). Ongoing and future short-read and, specifically, long-read genome sequencing analyses will likely unveil the overall importance of SVs in known and to-be-identified genes for HL. However, the added overall diagnostic yield of short-read genome sequencing was reported to be limited ($\sim 8\%$) when compared to that of exome sequencing (Wojcik et al. 2024). Currently, high fidelity long-read genome sequencing can reveal the most comprehensive variant dataset when using a single technology (Kucuk et al. 2023) but to be implemented as a first-tier test, its costs need to decrease substantially.

A further reason for missing the causative genetic defects is that the assumed inheritance pattern of HL was incorrect. Isolated cases in the AR group, for example, might be explained by monoallelic de novo variants. This has been shown previously for HL (Smits et al. 2019; Wesdorp et al. 2018) and is substantiated by Klimara et al., who described that de novo variants were causative in at least ~1% of probands for whom a genetic diagnosis was established (Klimara et al. 2022). Also, the genetic heterogeneity of HL in families and/or the presence of phenocopies may have masked the true inheritance pattern of the condition.

Finally, the low percentage of diagnoses might well be due to deselection of the relevant genes and variants in our approach. This includes the decision to exclude genes linked to disease in OMIM in the AR group, despite the possibility that variants in the same genes can lead to different disorders, as shown here for IKZF2. The main reason for applying the stringent strategy for variant prioritization and thereby reduction of candidate variants is the effort needed for follow-up in families to confirm co-segregation of variants with HL. The recruitment of family members for both genotyping and phenotyping after the clinical diagnostic phase turned out to be time-consuming and often with limited or no success. Therefore, the inclusion of parents of infants and young adults already in medical genetic testing and/or of additional family members, especially in case of dominantly inherited HL, is highly recommended. This will not only facilitate variant interpretation in medical genetic testing but also aid in the identification of novel genes for HL.

Besides inclusion of family members in medical genetic testing, an improved strategy for the selection of candidate variants could increase the probability of co-segregation with HL and enable the assessment of all genes. Greene et al. (2023) designed such a strategy and applied the Bayesian genetic association method BeviMed to rare variants in coding genes to identify genetic aetiologies of rare diseases. Genomes of 77,539 individuals from the 100,000 Genomes

Project were used, including family members as well as controls. For HL, this strategy was applied to about 700 probands with hearing/ear disorders, the vast majority with non-syndromic HL. Two strong novel associations with HL were identified, *GPR156* and *FMN1*, in addition to fifteen known gene associations. Increasing the number of cases by combining different cohorts of presumed HHL and controls could increase the power to identify novel genes for HL.

In the AD group, the strategy applied in the present study associated *IKZF2* with non-syndromic SNHL. The *IKZF2*encoded Helios is a member of the Ikaros family of ZF transcription factors together with the namesake Ikaros (*IKZF1*) and Aiolos (*IKZF3*), Eos (*IKZF4*) and Pegasus (*IKZF5*). Their function has been studied in neurodevelopment but most extensively in hematopoietic cell lineages (Alsiö et al. 2013; Giralt et al. 2020; Martín-Ibáñez et al. 2017; Read et al. 2021 and references therein). This is partly due to their association with inborn errors of the immune system, thrombocytopenia, and/or predisposition to leukaemia (*IKZF1* and *IKZF3*) and to somatic defects that are frequently occurring in haematological malignancies (*IKZF1* and *IKZF2*) (Kuehn et al. 2016; Lentaigne et al. 2019; Park et al. 2019; Shahin et al. 2022; Yamashita et al. 2021).

Monoallelic germline defects of IKZF2 have been found to underlie immunodeficiencies and autoimmunity (with incomplete penetrance), and a biallelic IKZF2 missense variant was found to cause syndromic immunodeficiency with osteopenia and hypothyroidism (Hetemäki et al. 2021; Shahin et al. 2021, 2022). During the present study of *IKZF2*, HL was also associated with IKZF2 since monoallelic variants affecting ZFs 3 and/or 2, were described in ICHAD syndrome (Immunodysregulation, Craniofacial anomalies, Hearing impairment, Athelia and Developmental delay) (Mohajeri et al 2023). These phenotypes suggest a complex genotype-phenotype correlation for IKZF2. A dominant-negative effect has been proposed for the two variants associated with ICHAD syndrome (Mohajeri et al 2023). In contrast, luciferase assays for Helios with the amino acid substitutions causing non-syndromic HL did not indicate such a dominant-negative effect. For the p.(His162Pro) variant, this is consistent with previous findings for the p.(His167Arg) variant of Ikaros (IKZF1) affecting the homologous residue of Helios His162 (Kuehn et al. 2016). However, a loss-of-function effect has been indicated for monoallelic truncating IKZF2 variants underlying isolated disorders of the immune system, suggesting haploinsufficiency as the underlying disease mechanism. The encoded proteins are either unstable (Hetemäki et al. 2021) or cannot homo- or hetero-dimerize with other Ikaros family members that are co-expressed in hematopoietic cell lineages (Shahin et al. 2022). Missense variants associated with such disorders, and that affect the region between the N-terminal DNA-binding and the C-terminal dimerization ZFs, are also suggested to have a loss-of-function effect since they disrupt or decrease interactions with members of the NuRD complex (Shahin et al. 2021, 2022). This complex is recruited by Helios to specific chromosomal targets and functions in repression or activation of transcription (Sridharan & Smale 2007).

Remarkably, HL has only been diagnosed in cases with variants directly affecting ZFs 2 and 3 (Mohajeri et al. 2023). Also, none of the cases (aged 2–63 years) with an immune dysfunction disorder due to monoallelic IKZF2 variants with a loss-of-function effect was indicated to have impaired hearing. Therefore, non-syndromic HL caused by the missense variants identified in the present study is unlikely to be due to an (incomplete) loss of function effect, although reduced protein synthesis or stability upon expression in HEK293 cells suggested such an effect. This is in line with the absence of symptoms of immunodeficiency or -dysregulation in the cases with non-syndromic HL. Therefore, we hypothesize that the underlying missense variants have an inner ear-specific effect, which might be of dominantnegative nature but less severe than that of variants associated with congenital HL as part of ICHAD syndrome. This hypothesis is supported by the recessive inheritance of HL in the cello mouse with the Ikzf2 p.(His517Glu) variant. This variant has a loss of function effect as it affects a Zn²⁺ coordinating residue of the 2nd C-terminal ZF with a deleterious effect on protein dimerization (Chessum et al. 2018).

It is tempting to speculate that Helios co-functions with Pegasus (*IKZF5*) in the inner ear. In mice, *IKZF5* is expressed in hair cells in early postnatal development (at low levels), as well as in the adult stage (Cai et al. 2015; Elkon et al. 2015; Liu et al. 2018; Orvis et al. 2021) and is critical for hearing (Bowl et al. 2017). Future studies are needed to address whether the (inner ear) function of dimers of variant Helios and WT Helios or Pegasus is indeed dominant-negatively affected by the missense variants identified in this study. Also, introducing the variants in mice can shed further light on the molecular function of *IKZF2* in the inner ear.

In conclusion, a candidate gene-based strategy was designed to prioritize DNA-variants derived from exome sequencing to identify 'novel' genes associated with non-syndromic HL. Applied to a cohort of approximately 460 index cases, this strategy associated specific missense variants in *IKZF2* with dominantly inherited progressive non-syndromic HL. Identification of more affected patients is required to fully define the emerging complex phenotype between *IKZF2* variants and the range of clinical phenotypes. The limited number of genetic diagnoses obtained using the designed strategy indicates that future studies addressing the missing aetiologies of HL would benefit from optimizing variant selection, utilizing larger patient cohorts, and inclusion of family members early in the process. Additionally, the ongoing implementation of genome

sequencing in medical genetic testing will not only increase the percentage of cases receiving a diagnosis but will also further support the identification of 'novel' genes for HL.

Supplementary Information The online version contains supplementary material available at https://doi.org/10.1007/s00439-024-02706-w.

Acknowledgements We thank all participants in the study "Hereditary hearing impairment in the Netherlands: elucidation of genetic causes, and clinical characterization" as part of the DOOFNL consortium. Also, we would like to thank Suzanne de Bruijn for her help in addressing structural variants, Ilse de Wijs for her support in collecting exome data and Saskia van der Velde-Visser for assistance in sample management. The DOOFNL consortium is a Dutch nationwide collaboration on hereditary hearing loss and consists of E. Aten, M.J. van den Boogaard, F.L.J. Cals, M.F. van Dooren, F.A. Ebbens, I. Feenstra, R.H. Free, H.H.W. de Gier, T.P.M. Goderie, L. Haer-Wigman, K. Hellingman, E.H. Hoefsloot, J.R. Hof, J. van de Kamp, S.G. Kant, J.S. Klein Wassink-Ruiter, H. Kremer, M. Kriek, A.M.A. Lachmeijer, C.P. Lanting, S.M. Maas, P. Merkus, R.J.E. Pennings, A. Plomp, F.G. Ropers, L.J.C. Rotteveel, M.P. van der Schroeff, A.L. Smit, J.J. Smits, V. Vernimmen, J.C.C. Widdershoven and H.G. Yntema.

Author contributions Material preparation, data collection and analysis were performed by Galuh Astuti, Lies Hoefsloot, Martijn A Huynen, Hannie Kremer, Anna Lehman, Jaap Oostrik, Ronald JE Pennings, Gayatri Ramakrishnan, Jeroen J Smits, Stuart E Turvey, Maryam Vaseghi-Shanjani, Hedwig M Velde, Mieke Wesdorp, Helger G Yntema, and the DOOFNL Consortium. The first draft of the manuscript was written by Hedwig M Velde and all authors commented on previous versions of the manuscript. All authors read and approved the final manuscript.

Funding This study was supported by a grant from the Heinsius-Houbolt foundation (to Hannie Kremer and Ronald JE Pennings).

Data availability The datasets generated during and/or analysed during the current study are available from the corresponding author on reasonable request.

Declarations

Conflict of interest The authors have no relevant financial or non-financial interests to disclose.

Consent to participate Written informed consent was received from all individuals adherent to the tenets of the Declaration of Helsinki.

Consent to publish The authors affirm that human research participants provided informed consent for publication of their anonymised data.

Ethics approval This study was approved by the local ethics committee (registration number: NL33648.091.10).

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References

- Adzhubei IA, Schmidt S, Peshkin L, Ramensky VE, Gerasimova A, Bork P, Kondrashov AS, Sunyaev SR (2010) A method and server for predicting damaging missense mutations. Nat Methods 7(4):248–249. https://doi.org/10.1038/nmeth0410-248
- Alsiö JM, Tarchini B, Cayouette M, Livesey FJ (2013) Ikaros promotes early-born neuronal fates in the cerebral cortex. Proc Natl Acad Sci USA 110(8):E716-725. https://doi.org/10.1073/pnas.12157 07110
- Baldarelli RM, Smith CM, Finger JH, Hayamizu TF, McCright IJ, Xu J, Shaw DR, Beal JS, Blodgett O, Campbell J, Corbani LE, Frost PJ, Giannatto SC, Miers DB, Kadin JA, Richardson JE, Ringwald M (2021) The mouse Gene Expression Database (GXD): 2021 update. Nucleic Acids Res 49(D1):D924-d931. https://doi.org/10. 1093/nar/gkaa914
- Baldarelli RM, Smith CL, Ringwald M, Richardson JE, Bult CJ (2024) Mouse Genome Informatics: an integrated knowledgebase system for the laboratory mouse. Genetics. https://doi.org/10.1093/genet ics/iyae031
- Blake JA, Baldarelli R, Kadin JA, Richardson JE, Smith CL, Bult CJ (2021) Mouse Genome Database (MGD): knowledgebase for mouse-human comparative biology. Nucleic Acids Res 49(D1):D981-d987. https://doi.org/10.1093/nar/gkaa1083
- Booth KT, Shearer AE (2022) Editorial to the Special Issue on "The molecular genetics of hearing and deafness." Hum Genet 141(3–4):305–306. https://doi.org/10.1007/s00439-022-02451-y
- Bowl MR, Simon MM, Ingham NJ, Greenaway S, Santos L, Cater H, Taylor S, Mason J, Kurbatova N, Pearson S, Bower LR, Clary DA, Meziane H, Reilly P, Minowa O, Kelsey L, Tocchini-Valentini GP, Gao X, Bradley A, Skarnes WC, Moore M, Beaudet AL, Justice MJ, Seavitt J, Dickinson ME, Wurst W, de Angelis MH, Herault Y, Wakana S, Nutter LMJ, Flenniken AM, McKerlie C, Murray SA, Svenson KL, Braun RE, West DB, Lloyd KCK, Adams DJ, White J, Karp N, Flicek P, Smedley D, Meehan TF, Parkinson HE, Teboul LM, Wells S, Steel KP, Mallon AM, Brown SDM (2017) A large scale hearing loss screen reveals an extensive unexplored genetic landscape for auditory dysfunction. Nat Commun 8(1):886. https://doi.org/10.1038/s41467-017-00595-4
- Cai T, Jen HI, Kang H, Klisch TJ, Zoghbi HY, Groves AK (2015) Characterization of the transcriptome of nascent hair cells and identification of direct targets of the Atoh1 transcription factor. J Neurosci 35(14):5870–5883. https://doi.org/10.1523/jneurosci. 5083-14.2015
- Chen T, Rohacek AM, Caporizzo M, Nankali A, Smits JJ, Oostrik J, Lanting CP, Kücük E, Gilissen C, van de Kamp JM, Pennings RJE, Rakowiecki SM, Kaestner KH, Ohlemiller KK, Oghalai JS, Kremer H, Prosser BL, Epstein DJ (2021) Cochlear supporting cells require GAS2 for cytoskeletal architecture and hearing. Dev Cell 56(10):1526-1540.e1527. https://doi.org/10.1016/j.devcel. 2021.04.017
- Chessum L, Matern MS, Kelly MC, Johnson SL, Ogawa Y, Milon B, McMurray M, Driver EC, Parker A, Song Y, Codner G, Esapa CT, Prescott J, Trent G, Wells S, Dragich AK, Frolenkov GI, Kelley MW, Marcotti W, Brown SDM, Elkon R, Bowl MR, Hertzano R (2018) Helios is a key transcriptional regulator of outer hair cell maturation. Nature 563(7733):696–700. https://doi.org/10.1038/ s41586-018-0728-4
- de Bruijn SE, Fadaie Z, Cremers FPM, Kremer H, Roosing S (2021) The impact of modern technologies on molecular diagnostic

success rates, with a focus on inherited retinal dystrophy and hearing loss. Int J Mol Sci. https://doi.org/10.3390/ijms22062943

- de Bruijn SE, Rodenburg K, Corominas J, Ben-Yosef T, Reurink J, Kremer H, Whelan L, Plomp AS, Berger W, Farrar GJ, Ferenc Kovács Á, Fajardy I, Hitti-Malin RJ, Weisschuh N, Weener ME, Sharon D, Pennings RJE, Haer-Wigman L, Hoyng CB, Nelen MR, Vissers LELM, van den Born LI, Gilissen C, Cremers FPM, Hoischen A, Neveling K, Roosing S (2023) Optical genome mapping and revisiting short-read genome sequencing data reveal previously overlooked structural variants disrupting retinal disease-associated genes. Genet Med 25(3):100345. https://doi.org/10.1016/j.gim. 2022.11.013
- Domínguez-Ruiz M, Ruiz-Palmero L, Buonfiglio PI, García-Vaquero I, Gómez-Rosas E, Goñi M, Villamar M, Morín M, Moreno-Pelayo MA, Elgoyhen AB, Del Castillo FJ, Dalamón V, Del Castillo I (2023) Novel pathogenic variants in the gene encoding stereocilin (STRC) causing non-syndromic moderate hearing loss in Spanish and Argentinean subjects. Biomedicines. https://doi.org/10.3390/ biomedicines11112943
- Elkon R, Milon B, Morrison L, Shah M, Vijayakumar S, Racherla M, Leitch CC, Silipino L, Hadi S, Weiss-Gayet M, Barras E, Schmid CD, Ait-Lounis A, Barnes A, Song Y, Eisenman DJ, Eliyahu E, Frolenkov GI, Strome SE, Durand B, Zaghloul NA, Jones SM, Reith W, Hertzano R (2015) RFX transcription factors are essential for hearing in mice. Nat Commun 6:8549. https://doi.org/10. 1038/ncomms9549
- Gendeaf Study Group, Mazzoli M, Van Camp GUY, Newton V, Giarbini N, Declau F, Parving A (2003) Recommendations for the description of genetic and audiological data for families with nonsyndromic hereditary hearing impairment. Audiol Med 1(2):148–150. https://doi.org/10.1080/16513860301713
- Giralt A, Brito V, Pardo M, Rubio SE, Marion-Poll L, Martín-Ibáñez R, Zamora-Moratalla A, Bosch C, Ballesteros JJ, Blasco E, García-Torralba A, Pascual M, Pumarola M, Alberch J, Ginés S, Martín ED, Segovia J, Soriano E, Canals JM (2020) Helios modulates the maturation of a CA1 neuronal subpopulation required for spatial memory formation. Exp Neurol 323:113095. https://doi.org/10. 1016/j.expneurol.2019.113095
- Grantham R (1974) Amino acid difference formula to help explain protein evolution. Science 185(4154):862–864. https://doi.org/10. 1126/science.185.4154.862
- Greene D, Pirri D, Frudd K, Sackey E, Al-Owain M, Giese APJ, Ramzan K, Riaz S, Yamanaka I, Boeckx N, Thys C, Gelb BD, Brennan P, Hartill V, Harvengt J, Kosho T, Mansour S, Masuno M, Ohata T, Stewart H, Taibah K, Turner CLS, Imtiaz F, Riazuddin S, Morisaki T, Ostergaard P, Loeys BL, Morisaki H, Ahmed ZM, Birdsey GM, Freson K, Mumford A, Turro E (2023) Genetic association analysis of 77,539 genomes reveals rare disease etiologies. Nat Med 29(3):679–688. https://doi.org/10.1038/ s41591-023-02211-z
- Groza T, Gomez FL, Mashhadi HH, Muñoz-Fuentes V, Gunes O, Wilson R, Cacheiro P, Frost A, Keskivali-Bond P, Vardal B, McCoy A, Cheng TK, Santos L, Wells S, Smedley D, Mallon AM, Parkinson H (2023) The International Mouse Phenotyping Consortium: comprehensive knockout phenotyping underpinning the study of human disease. Nucleic Acids Res 51(D1):D1038-d1045. https://doi.org/10.1093/nar/gkac972
- Haarman AEG, Thiadens A, van Tienhoven M, Loudon SE, de Klein J, Brosens E, Polling JR, van der Schoot V, Bouman A, Kievit AJA, Hoefsloot LH, Klaver CCW, Verhoeven VJM (2022) Whole exome sequencing of known eye genes reveals genetic causes for high myopia. Hum Mol Genet 31(19):3290–3298. https://doi.org/ 10.1093/hmg/ddac113
- Haer-Wigman L, van Zelst-Stams WA, Pfundt R, van den Born LI, Klaver CC, Verheij JB, Hoyng CB, Breuning MH, Boon CJ, Kievit AJ, Verhoeven VJ, Pott JW, Sallevelt SC, van Hagen JM, Plomp

AS, Kroes HY, Lelieveld SH, Hehir-Kwa JY, Castelein S, Nelen M, Scheffer H, Lugtenberg D, Cremers FP, Hoefsloot L, Yntema HG (2017) Diagnostic exome sequencing in 266 Dutch patients with visual impairment. Eur J Hum Genet 25(5):591–599. https://doi.org/10.1038/ejhg.2017.9

- Hetemäki I, Kaustio M, Kinnunen M, Heikkilä N, Keskitalo S, Nowlan K, Miettinen S, Sarkkinen J, Glumoff V, Andersson N, Kettunen K, Vanhanen R, Nurmi K, Eklund KK, Dunkel J, Mäyränpää MI, Schlums H, Arstila TP, Kisand K, Bryceson YT, Peterson P, Otava U, Syrjänen J, Saarela J, Varjosalo M, Kekäläinen E (2021) Loss-of-function mutation in IKZF2 leads to immunodeficiency with dysregulated germinal center reactions and reduction of MAIT cells. Sci Immunol 6(65):eabe3454. https://doi.org/10.1126/sciim munol.abe3454
- Huygen PL, Pennings RJ, Cremers CW (2003) Characterizing and distinguishing progressive phenotypes in nonsyndromic autosomal dominant hearing impairment. Audiol Med 1(1):37–46. https:// doi.org/10.1080/16513860310003049
- Internation Organization for Stardardization (2017). ISO 7029:2017 acoustics—statistical distribution of hearing thresholds related to age and gender. Geneva, Switzerland
- Jacobson GP, Newman CW (1990) The development of the Dizziness Handicap Inventory. Arch Otolaryngol Head Neck Surg 116(4):424–427. https://doi.org/10.1001/archotol.1990.01870 040046011
- Jaganathan K, Kyriazopoulou Panagiotopoulou S, McRae JF, Darbandi SF, Knowles D, Li YI, Kosmicki JA, Arbelaez J, Cui W, Schwartz GB, Chow ED, Kanterakis E, Gao H, Kia A, Batzoglou S, Sanders SJ, Farh KK (2019) Predicting splicing from primary sequence with deep learning. Cell 176(3):535-548.e524. https://doi.org/10. 1016/j.cell.2018.12.015
- Jumper J, Evans R, Pritzel A, Green T, Figurnov M, Ronneberger O, Tunyasuvunakool K, Bates R, Žídek A, Potapenko A, Bridgland A, Meyer C, Kohl SAA, Ballard AJ, Cowie A, Romera-Paredes B, Nikolov S, Jain R, Adler J, Back T, Petersen S, Reiman D, Clancy E, Zielinski M, Steinegger M, Pacholska M, Berghammer T, Bodenstein S, Silver D, Vinyals O, Senior AW, Kavukcuoglu K, Kohli P, Hassabis D (2021) Highly accurate protein structure prediction with AlphaFold. Nature 596(7873):583–589. https:// doi.org/10.1038/s41586-021-03819-2
- Karczewski KJ, Francioli LC, Tiao G, Cummings BB, Alföldi J, Wang Q, Collins RL, Laricchia KM, Ganna A, Birnbaum DP, Gauthier LD, Brand H, Solomonson M, Watts NA, Rhodes D, Singer-Berk M, England EM, Seaby EG, Kosmicki JA, Walters RK, Tashman K, Farjoun Y, Banks E, Poterba T, Wang A, Seed C, Whiffin N, Chong JX, Samocha KE, Pierce-Hoffman E, Zappala Z, O'Donnell-Luria AH, Minikel EV, Weisburd B, Lek M, Ware JS, Vittal C, Armean IM, Bergelson L, Cibulskis K, Connolly KM, Covarrubias M, Donnelly S, Ferriera S, Gabriel S, Gentry J, Gupta N, Jeandet T, Kaplan D, Llanwarne C, Munshi R, Novod S, Petrillo N, Roazen D, Ruano-Rubio V, Saltzman A, Schleicher M, Soto J, Tibbetts K, Tolonen C, Wade G, Talkowski ME, Neale BM, Daly MJ, MacArthur DG (2020) The mutational constraint spectrum quantified from variation in 141,456 humans. Nature 581(7809):434–443. https://doi.org/10.1038/s41586-020-2308-7
- Keizer DP (1952) A new form of congenital hereditary deafness (Waardenburg's syndrome). Ned Tijdschr Geneeskd 96(41):2541– 2543 (Een nieuwe vorm van congenitale erfelijke doofheid (syndroom van Waardenburg))
- Kinney CE (1950) The pathology of hereditary deafness. Ann Otol Rhinol Laryngol 59(4):1117–1122. https://doi.org/10.1177/00034 8945005900415
- Kircher M, Witten DM, Jain P, O'Roak BJ, Cooper GM, Shendure J (2014) A general framework for estimating the relative pathogenicity of human genetic variants. Nat Genet 46(3):310–315. https://doi.org/10.1038/ng.2892

- Klimara MJ, Nishimura C, Wang D, Kolbe DL, Schaefer AM, Walls WD, Frees KL, Smith RJH, Azaiez H (2022) De novo variants are a common cause of genetic hearing loss. Genet Med 24(12):2555–2567. https://doi.org/10.1016/j.gim.2022.08.028
- Kremer H (2019) Hereditary hearing loss; about the known and the unknown. Hear Res 376:58–68. https://doi.org/10.1016/j.heares. 2019.01.003
- Kremer H (2022) Novel gene discovery for hearing loss and other routes to increased diagnostic rates. Hum Genet 141(3–4):383– 386. https://doi.org/10.1007/s00439-021-02374-0
- Krumm N, Sudmant PH, Ko A, O'Roak BJ, Malig M, Coe BP, Quinlan AR, Nickerson DA, Eichler EE (2012) Copy number variation detection and genotyping from exome sequence data. Genome Res 22(8):1525–1532. https://doi.org/10.1101/gr.138115.112
- Krupke DM, Begley DA, Sundberg JP, Richardson JE, Neuhauser SB, Bult CJ (2017) The mouse tumor biology database: a comprehensive resource for mouse models of human cancer. Cancer Res 77(21):e67–e70. https://doi.org/10.1158/0008-5472.Can-17-0584
- Kucuk E, van der Sanden B, O'Gorman L, Kwint M, Derks R, Wenger AM, Lambert C, Chakraborty S, Baybayan P, Rowell WJ, Brunner HG, Vissers L, Hoischen A, Gilissen C (2023) Comprehensive de novo mutation discovery with HiFi long-read sequencing. Genome Med 15(1):34. https://doi.org/10.1186/s13073-023-01183-6
- Kuehn HS, Boisson B, Cunningham-Rundles C, Reichenbach J, Stray-Pedersen A, Gelfand EW, Maffucci P, Pierce KR, Abbott JK, Voelkerding KV, South ST, Augustine NH, Bush JS, Dolen WK, Wray BB, Itan Y, Cobat A, Sorte HS, Ganesan S, Prader S, Martins TB, Lawrence MG, Orange JS, Calvo KR, Niemela JE, Casanova JL, Hill FTA, HR, Kumánovics A, Conley ME, Rosenzweig SD. (2016) Loss of B cells in patients with heterozygous mutations in IKAROS. N Engl J Med 374(11):1032–1043. https://doi.org/10. 1056/NEJMoa1512234
- Laurent S, Gehrig C, Nouspikel T, Amr SS, Oza A, Murphy E, Vannier A, Béna FS, Carminho-Rodrigues MT, Blouin JL, Van Cao H, Abramowicz M, Paoloni-Giacobino A, Guipponi M (2021) Molecular characterization of pathogenic OTOA gene conversions in hearing loss patients. Hum Mutat 42(4):373–377. https://doi.org/10.1002/humu.24167
- Lentaigne C, Greene D, Sivapalaratnam S, Favier R, Seyres D, Thys C, Grassi L, Mangles S, Sibson K, Stubbs M, Burden F, Bordet JC, Armari-Alla C, Erber W, Farrow S, Gleadall N, Gomez K, Megy K, Papadia S, Penkett CJ, Sims MC, Stefanucci L, Stephens JC, Read RJ, Stirrups KE, Ouwehand WH, Laffan MA, Frontini M, Freson K, Turro E (2019) Germline mutations in the transcription factor IKZF5 cause thrombocytopenia. Blood 134(23):2070– 2081. https://doi.org/10.1182/blood.2019000782
- Lewis MA, Schulte BA, Dubno JR, Steel KP (2022) Investigating the characteristics of genes and variants associated with self-reported hearing difficulty in older adults in the UK Biobank. BMC Biol 20(1):150. https://doi.org/10.1186/s12915-022-01349-5
- Liu H, Chen L, Giffen KP, Stringham ST, Li Y, Judge PD, Beisel KW, He DZZ (2018) Cell-specific transcriptome analysis shows that adult pillar and Deiters' cells express genes encoding machinery for specializations of cochlear hair cells. Front Mol Neurosci 11:356. https://doi.org/10.3389/fnmol.2018.00356
- Luijendijk MW, van de Pol TJ, van Duijnhoven G, den Hollander AI, ten Caat J, van Limpt V, Brunner HG, Kremer H, Cremers FP (2003) Cloning, characterization, and mRNA expression analysis of novel human fetal cochlear cDNAs. Genomics 82(4):480–490. https://doi.org/10.1016/s0888-7543(03)00150-2
- Lv J, Wang H, Cheng X, Chen Y, Wang D, Zhang L, Cao Q, Tang H, Hu S, Gao K, Xun M, Wang J, Wang Z, Zhu B, Cui C, Gao Z, Guo L, Yu S, Jiang L, Yin Y, Zhang J, Chen B, Wang W, Chai R, Chen ZY, Li H, Shu Y (2024) AAV1-hOTOF gene therapy for autosomal recessive deafness 9: a single-arm trial. Lancet. https:// doi.org/10.1016/s0140-6736(23)02874-x

- Martín-Ibáñez R, Pardo M, Giralt A, Miguez A, Guardia I, Marion-Poll L, Herranz C, Esgleas M, Garcia-Díaz Barriga G, Edel MJ, Vicario-Abejón C, Alberch J, Girault JA, Chan S, Kastner P, Canals JM (2017) Helios expression coordinates the development of a subset of striatopallidal medium spiny neurons. Development 144(8):1566–1577. https://doi.org/10.1242/dev.138248
- Mayr D, Shahin T, Shoeb M, Kuehn H, Hoeger B, Giuliani S, Gawriyski L, Petronczki Ö, Hadjadj J, Köstel Bal S, Zoghi S, Haimel M, Jimenez Heredia R, Boutboul D, Triebwasser M, Rialland-Battisti F, Tangye S, Fleisher T, Rezaei N, Boztug K (2022) P1408: monoallelic and biallelic germline mutations affecting the transcription factor helios cause pleiotropic defects of immunity. HemaSphere 6:1292–1293. https://doi.org/10.1097/01.HS9.0000848492.66300.
 97
- McKusick-Nathans Institute of Genetic Medicine. (n.d.). Online Mendelian Inheritance in Man, OMIM®. Johns Hopkins University. Retrieved 02 from https://omim.org/
- Miller DT, Lee K, Chung WK, Gordon AS, Herman GE, Klein TE, Stewart DR, Amendola LM, Adelman K, Bale SJ, Gollob MH, Harrison SM, Hershberger RE, McKelvey K, Richards CS, Vlangos CN, Watson MS, Martin CL (2021) ACMG SF v3.0 list for reporting of secondary findings in clinical exome and genome sequencing: a policy statement of the American College of Medical Genetics and Genomics (ACMG). Genet Med 23(8):1381– 1390. https://doi.org/10.1038/s41436-021-01172-3
- Mohajeri A, Vaseghi-Shanjani M, Rosenfeld JA, Yang GX, Lu H, Sharma M, Lin S, Salman A, Waqas M, Sababi Azamian M, Worley KC, Del Bel KL, Kozak FK, Rahmanian R, Biggs CM, Hildebrand KJ, Lalani SR, Nicholas SK, Scott DA, Mostafavi S, van Karnebeek C, Henkelman E, Halparin J, Yang CL, Armstrong L, Turvey SE, Lehman A (2023) Dominant negative variants in IKZF2 cause ICHAD syndrome, a new disorder characterised by immunodysregulation, craniofacial anomalies, hearing impairment, athelia and developmental delay. J Med Genet. https://doi. org/10.1136/jmg-2022-109127
- Ng PC, Henikoff S (2001) Predicting deleterious amino acid substitutions. Genome Res 11(5):863–874. https://doi.org/10.1101/gr. 176601
- Orvis J, Gottfried B, Kancherla J, Adkins RS, Song Y, Dror AA, Olley D, Rose K, Chrysostomou E, Kelly MC, Milon B, Matern MS, Azaiez H, Herb B, Colantuoni C, Carter RL, Ament SA, Kelley MW, White O, Bravo HC, Mahurkar A, Hertzano R (2021) gEAR: Gene Expression Analysis Resource portal for community-driven, multi-omic data exploration. Nat Methods 18(8):843–844. https:// doi.org/10.1038/s41592-021-01200-9
- Oza AM, DiStefano MT, Hemphill SE, Cushman BJ, Grant AR, Siegert RK, Shen J, Chapin A, Boczek NJ, Schimmenti LA, Murry JB, Hasadsri L, Nara K, Kenna M, Booth KT, Azaiez H, Griffith A, Avraham KB, Kremer H, Rehm HL, Amr SS, Abou Tayoun AN (2018) Expert specification of the ACMG/AMP variant interpretation guidelines for genetic hearing loss. Hum Mutat 39(11):1593– 1613. https://doi.org/10.1002/humu.23630
- Park SM, Cho H, Thornton AM, Barlowe TS, Chou T, Chhangawala S, Fairchild L, Taggart J, Chow A, Schurer A, Gruet A, Witkin MD, Kim JH, Shevach EM, Krivtsov A, Armstrong SA, Leslie C, Kharas MG (2019) IKZF2 drives leukemia stem cell self-renewal and inhibits myeloid differentiation. Cell Stem Cell 24(1):153-165.e157. https://doi.org/10.1016/j.stem.2018.10.016
- Perry J, Redfield S, Oza A, Rouse S, Stewart C, Khela H, Srinivasan T, Albano V, Shearer E, Kenna M (2023) Exome sequencing expands the genetic diagnostic spectrum for pediatric hearing loss. Laryngoscope 133(9):2417–2424. https://doi.org/10.1002/lary.30507
- Plagnol V, Curtis J, Epstein M, Mok KY, Stebbings E, Grigoriadou S, Wood NW, Hambleton S, Burns SO, Thrasher AJ, Kumararatne D, Doffinger R, Nejentsev S (2012) A robust model for read count data in exome sequencing experiments and implications for copy

number variant calling. Bioinformatics 28(21):2747–2754. https://doi.org/10.1093/bioinformatics/bts526

- Pollard KS, Hubisz MJ, Rosenbloom KR, Siepel A (2010) Detection of nonneutral substitution rates on mammalian phylogenies. Genome Res 20(1):110–121. https://doi.org/10.1101/gr.097857.109
- Porubsky D, Eichler EE (2024) A 25-year odyssey of genomic technology advances and structural variant discovery. Cell 187(5):1024– 1037. https://doi.org/10.1016/j.cell.2024.01.002
- Powell MD, Read KA, Sreekumar BK, Oestreich KJ (2019) Ikaros zinc finger transcription factors: regulators of cytokine signaling pathways and CD4(+) T helper cell differentiation. Front Immunol 10:1299. https://doi.org/10.3389/fimmu.2019.01299
- Read KA, Jones DM, Freud AG, Oestreich KJ (2021) Established and emergent roles for Ikaros transcription factors in lymphoid cell development and function. Immunol Rev 300(1):82–99. https:// doi.org/10.1111/imr.12936
- Reurink J, Weisschuh N, Garanto A, Dockery A, van den Born LI, Fajardy I, Haer-Wigman L, Kohl S, Wissinger B, Farrar GJ, Ben-Yosef T, Pfiffner FK, Berger W, Weener ME, Dudakova L, Liskova P, Sharon D, Salameh M, Offenheim A, Heon E, Girotto G, Gasparini P, Morgan A, Bergen AA, Ten Brink JB, Klaver CCW, Tranebjærg L, Rendtorff ND, Vermeer S, Smits JJ, Pennings RJE, Aben M, Oostrik J, Astuti GDN, Corominas Galbany J, Kroes HY, Phan M, van Zelst-Stams WAG, Thiadens AAHJ, Verheij JBGM, van Schooneveld MJ, de Bruijn SE, Li CHZ, Hoyng CB, Gilissen C, Vissers LELM, Cremers FPM, Kremer H, van Wijk E, Roosing S (2023) Whole genome sequencing for USH2A-associated disease reveals several pathogenic deep-intronic variants that are amenable to splice correction. HGG Adv 4(2):100181. https://doi. org/10.1016/j.xhgg.2023.100181
- Richards S, Aziz N, Bale S, Bick D, Das S, Gastier-Foster J, Grody WW, Hegde M, Lyon E, Spector E, Voelkerding K, Rehm HL, Committee ALQA (2015) Standards and guidelines for the interpretation of sequence variants: a joint consensus recommendation of the American College of Medical Genetics and Genomics and the Association for Molecular Pathology. Genet Med 17(5):405– 424. https://doi.org/10.1038/gim.2015.30
- Robertson NG, Khetarpal U, Gutiérrez-Espeleta GA, Bieber FR, Morton CC (1994) Isolation of novel and known genes from a human fetal cochlear cDNA library using subtractive hybridization and differential screening. Genomics 23(1):42–50. https://doi.org/10. 1006/geno.1994.1457
- Schobers G, Schieving JH, Yntema HG, Pennings M, Pfundt R, Derks R, Hofste T, de Wijs I, Wieskamp N, van den Heuvel S, Galbany JC, Gilissen C, Nelen M, Brunner HG, Kleefstra T, Kamsteeg EJ, Willemsen M, Vissers L (2022) Reanalysis of exome negative patients with rare disease: a pragmatic workflow for diagnostic applications. Genome Med 14(1):66. https://doi.org/10.1186/ s13073-022-01069-z
- Schrauwen I, Hasin-Brumshtein Y, Corneveaux JJ, Ohmen J, White C, Allen AN, Lusis AJ, Van Camp G, Huentelman MJ, Friedman RA (2016) A comprehensive catalogue of the coding and non-coding transcripts of the human inner ear. Hear Res 333:266–274. https:// doi.org/10.1016/j.heares.2015.08.013
- Schwarz JM, Cooper DN, Schuelke M, Seelow D (2014) Mutation-Taster2: mutation prediction for the deep-sequencing age. Nat Methods 11(4):361–362. https://doi.org/10.1038/nmeth.2890
- Schymkowitz J, Borg J, Stricher F, Nys R, Rousseau F, Serrano L (2005) The FoldX web server: an online force field. Nucleic Acids Res 33(Web Server issue):W382-388. https://doi.org/10.1093/nar/ gki387
- Shahin T, Kuehn HS, Shoeb MR, Gawriyski L, Giuliani S, Repiscak P, Hoeger B, Yüce Petronczki Ö, Bal SK, Zoghi S, Dmytrus J, Seruggia D, Castanon I, Rezaei N, Varjosalo M, Halbritter F, Rosenzweig SD, Boztug K (2021) Germline biallelic mutation affecting the transcription factor Helios causes pleiotropic defects

of immunity. Sci Immunol 6(65):eabe3981. https://doi.org/10. 1126/sciimmunol.abe3981

- Shahin T, Mayr D, Shoeb MR, Kuehn HS, Hoeger B, Giuliani S, Gawriyski LM, Petronczki ÖY, Hadjadj J, Bal SK, Zoghi S, Haimel M, Jimenez Heredia R, Boutboul D, Triebwasser MP, Rialland-Battisti F, Costedoat Chalumeau N, Quartier P, Tangye SG, Fleisher TA, Rezaei N, Romberg N, Latour S, Varjosalo M, Halbritter F, Rieux-Laucat F, Castanon I, Rosenzweig SD, Boztug K (2022) Identification of germline monoallelic mutations in IKZF2 in patients with immune dysregulation. Blood Adv 6(7):2444–2451. https://doi.org/10.1182/bloodadvances.2021006367
- Sloan-Heggen CM, Bierer AO, Shearer AE, Kolbe DL, Nishimura CJ, Frees KL, Ephraim SS, Shibata SB, Booth KT, Campbell CA, Ranum PT, Weaver AE, Black-Ziegelbein EA, Wang D, Azaiez H, Smith RJH (2016) Comprehensive genetic testing in the clinical evaluation of 1119 patients with hearing loss. Hum Genet 135(4):441–450. https://doi.org/10.1007/ s00439-016-1648-8
- Smits JJ, Oostrik J, Beynon AJ, Kant SG, de Koning Gans PAM, Rotteveel LJC, Klein Wassink-Ruiter JS, Free RH, Maas SM, van de Kamp J, Merkus P, Koole W, Feenstra I, Admiraal RJC, Lanting CP, Schraders M, Yntema HG, Pennings RJE, Kremer H (2019) De novo and inherited loss-of-function variants of ATP2B2 are associated with rapidly progressive hearing impairment. Hum Genet 138(1):61–72. https://doi.org/10.1007/s00439-018-1965-1
- Sobreira N, Schiettecatte F, Valle D, Hamosh A (2015) GeneMatcher: a matching tool for connecting investigators with an interest in the same gene. Hum Mutat 36(10):928–930. https://doi.org/10. 1002/humu.22844
- Sridharan R, Smale ST (2007) Predominant interaction of both Ikaros and Helios with the NuRD complex in immature thymocytes. J Biol Chem 282(41):30227–30238. https://doi.org/10.1074/jbc. M702541200
- Steinhaus R, Proft S, Schuelke M, Cooper DN, Schwarz JM, Seelow D (2021) MutationTaster2021. Nucleic Acids Res 49(W1):W446w451. https://doi.org/10.1093/nar/gkab266
- Szklarczyk D, Kirsch R, Koutrouli M, Nastou K, Mehryary F, Hachilif R, Gable AL, Fang T, Doncheva NT, Pyysalo S, Bork P, Jensen LJ, von Mering C (2023) The STRING database in 2023: protein-protein association networks and functional enrichment analyses for any sequenced genome of interest. Nucleic Acids Res 51(D1):D638-d646. https://doi.org/10.1093/nar/gkac1000
- Tropitzsch A, Schade-Mann T, Gamerdinger P, Dofek S, Schulte B, Schulze M, Battke F, Fehr S, Biskup S, Heyd A, Müller M, Löwenheim H, Vona B, Holderried M (2022) Diagnostic yield of targeted hearing loss gene panel sequencing in a large German cohort with a balanced age distribution from a single diagnostic center: an eight-year study. Ear Hear 43(3):1049–1066. https:// doi.org/10.1097/aud.00000000001159
- Vaché C, Puechberty J, Faugère V, Darmaisin F, Liquori A, Baux D, Blanchet C, Garcia-Garcia G, Meunier I, Pellestor F, Koenig M, Roux AF (2020) A 4.6 Mb inversion leading to PCDH15-LINC00844 and BICC1-PCDH15 fusion transcripts as a new pathogenic mechanism implicated in usher syndrome type 1. Front Genet 11:623. https://doi.org/10.3389/fgene.2020.00623
- Van Camp G, Smith RJH. Hereditary hearing loss homepage. https:// hereditaryhearingloss.org
- Varadi M, Anyango S, Deshpande M, Nair S, Natassia C, Yordanova G, Yuan D, Stroe O, Wood G, Laydon A, Žídek A, Green T, Tunyasuvunakool K, Petersen S, Jumper J, Clancy E, Green R, Vora A, Lutfi M, Figurnov M, Cowie A, Hobbs N, Kohli P, Kleywegt G, Birney E, Hassabis D, Velankar S (2022) AlphaFold Protein Structure Database: massively expanding the structural coverage of protein-sequence space with high-accuracy models. Nucleic Acids Res 50(D1):D439-d444. https://doi.org/10.1093/nar/gkab1 061

- Velde HM, Huizenga XJJ, Yntema HG, Haer-Wigman L, Beynon AJ, Oostrik J, Pegge SAH, Kremer H, Lanting CP, Pennings RJE (2023) Genotype and phenotype analyses of a novel WFS1 variant (c.2512C>T p.(Pro838Ser)) associated with DFNA6/14/38. Genes (Basel). https://doi.org/10.3390/genes14020457
- Wesdorp M, de Koning Gans PAM, Schraders M, Oostrik J, Huynen MA, Venselaar H, Beynon AJ, van Gaalen J, Piai V, Voermans N, van Rossum MM, Hartel BP, Lelieveld SH, Wiel L, Verbist B, Rotteveel LJ, van Dooren MF, Lichtner P, Kunst HPM, Feenstra I, Admiraal RJC, Yntema HG, Hoefsloot LH, Pennings RJE, Kremer H (2018) Heterozygous missense variants of LMX1A lead to nonsyndromic hearing impairment and vestibular dysfunction. Hum Genet 137(5):389–400. https://doi.org/10.1007/ s00439-018-1880-5
- Whitney SL, Wrisley DM, Brown KE, Furman JM (2004) Is perception of handicap related to functional performance in persons with vestibular dysfunction? Otol Neurotol 25(2):139–143. https://doi. org/10.1097/00129492-200403000-00010
- Wojcik MH, Lemire G, Berger E, Zaki MS, Wissmann M, Win W, White SM, Weisburd B, Wieczorek D, Waddell LB, Verboon JM, VanNoy GE, Töpf A, Tan TY, Syrbe S, Strehlow V, Straub V, Stenton SL, Snow H, Singer-Berk M, Silver J, Shril S, Seaby EG, Schneider R, Sankaran VG, Sanchis-Juan A, Russell KA, Reinson K, Ravenscroft G, Radtke M, Popp D, Polster T, Platzer K, Pierce EA, Place EM, Pajusalu S, Pais L, Õunap K, Osei-Owusu I, Opperman H, Okur V, Oja KT, O'Leary M, O'Heir E, Morel CF, Merkenschlager A, Marchant RG, Mangilog BE, Madden JA, MacArthur D, Lovgren A, Lerner-Ellis JP, Lin J, Laing N, Hildebrandt F, Hentschel J, Groopman E, Goodrich J, Gleeson JG, Ghaoui R, Genetti CA, Gburek-Augustat J, Gazda HT, Ganesh VS, Ganapathi M, Gallacher L, Fu JM, Evangelista

E, England E, Donkervoort S, DiTroia S, Cooper ST, Chung WK, Christodoulou J, Chao KR, Cato LD, Bujakowska KM, Bryen SJ, Brand H, Bönnemann CG, Beggs AH, Baxter SM, Bartolomaeus T, Agrawal PB, Talkowski M, Austin-Tse C, Abou Jamra R, Rehm HL, O'Donnell-Luria A (2024) Genome sequencing for diagnosing rare diseases. N Engl J Med 390(21):1985–1997. https://doi. org/10.1056/NEJMoa2314761

- Yamashita M, Kuehn HS, Okuyama K, Okada S, Inoue Y, Mitsuiki N, Imai K, Takagi M, Kanegane H, Takeuchi M, Shimojo N, Tsumura M, Padhi AK, Zhang KYJ, Boisson B, Casanova JL, Ohara O, Rosenzweig SD, Taniuchi I, Morio T (2021) A variant in human AIOLOS impairs adaptive immunity by interfering with IKAROS. Nat Immunol 22(7):893–903. https://doi.org/10.1038/ s41590-021-00951-z
- Zazo Seco C, Wesdorp M, Feenstra I, Pfundt R, Hehir-Kwa JY, Lelieveld SH, Castelein S, Gilissen C, de Wijs IJ, Admiraal RJ, Pennings RJ, Kunst HP, van de Kamp JM, Tamminga S, Houweling AC, Plomp AS, Maas SM, de Koning Gans PA, Kant SG, de Geus CM, Frints SG, Vanhoutte EK, van Dooren MF, van den Boogaard MH, Scheffer H, Nelen M, Kremer H, Hoefsloot L, Schraders M, Yntema HG (2017) The diagnostic yield of wholeexome sequencing targeting a gene panel for hearing impairment in The Netherlands. Eur J Hum Genet 25(3):308–314. https://doi. org/10.1038/ejhg.2016.182

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