

## Next-generation sequencing of 32 genes associated with hereditary aortopathies and related disorders of connective tissue in a cohort of 199 patients

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**Purpose:** Heritable factors play an important etiologic role in connective tissue disorders (CTD) with vascular involvement, and a genetic diagnosis is getting increasingly important for gene-tailored, personalized patient management.

**Methods:** We analyzed 32 disease-associated genes by using targeted next-generation sequencing and exome sequencing in a clinically relevant cohort of 199 individuals. We classified and refined sequence variants according to their likelihood for pathogenicity.

**Results:** We identified 1 pathogenic variant (PV; in *FBN1* or *SMAD3*) in 15 patients (7.5%) and  $\geq 1$  likely pathogenic variant (LPV; in *COL3A1*, *FBN1*, *FBN2*, *LOX*, *MYH11*, *SMAD3*, *TGFBR1*, or *TGFBR2*) in 19 individuals (9.6%), together resulting in 17.1% diagnostic yield. Thirteen PV/LPV were novel. Of PV/LPV-negative patients 47 (23.6%) showed  $\geq 1$  variant of uncertain significance (VUS). Twenty-five patients had concomitant variants. In-depth

## INTRODUCTION

Hereditary connective tissue disorders (HCTDs) comprise a large group of diseases with various manifestations affecting the skin, eyes, internal organs (e.g., the lung and intestine), as well as the neurological, craniofacial, musculoskeletal, and cardiovascular systems.<sup>1</sup> Although conditions are individually rare, together they represent a considerable health burden.<sup>2</sup>

evaluation of reported/calculated variant classes resulted in reclassification of 19.8% of variants.

**Conclusion:** Variant classification and refinement are essential for shaping mutational spectra of disease genes, thereby improving clinical sensitivity. Obligate stringent multigene analysis is a powerful tool for identifying genetic causes of clinically related CTDs. Nonetheless, the relatively high rate of PV/LPV/VUS-negative patients underscores the existence of yet unknown disease loci and/or oligogenic/polygenic inheritance.

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Several HCTDs are complicated by severe, partially lifethreatening vascular complications such as aortic dilatations, aneurysms, dissections, or arterial tortuosity.<sup>3</sup> HCTDs with vascular involvement include both syndromic forms such as Marfan syndrome (MFS), Loeys–Dietz syndrome (LDS), and vascular Ehlers–Danlos syndrome (EDS) and nonsyndromic presentations of thoracic aortic aneurysm/dissection (TAAD).

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Together, these conditions are referred to as hereditary aortopathies.<sup>4</sup> Three main pathomechanisms have emerged for hereditary aortopathies: (1) abnormal extracellular matrix assembly and maintenance/homeostasis, (2) increased TGF-β signaling, and (3) disruption of the vascular smooth muscle cell contractile apparatus.<sup>5,6</sup> Accordingly, most known genes implicated in hereditary aortopathies encode structural connective tissue proteins such as collagens and fibrillins, enzymes involved in the biosynthesis or processing of structural connective tissue proteins (e.g., PLOD1), TGF-β signaling proteins (e.g., TGFBR1, SMAD3), or regulators and components of the cytoskeleton (e.g., MYH11).<sup>3</sup> Connective tissue is found in different organs, thus a genetic alteration in a single HCTD-related disease gene can manifest in several body systems. This pleiotropy results in clinically overlapping multisystemic findings, which hampers clinical diagnosis of a specific disorder in the majority of patients.<sup>1</sup> However, patient management including proper surveillance, timely surgical interventions, and pharmacological therapy depends on accurate diagnosis; this is already reflected in guidelines on the diagnosis and treatment of aortic diseases belonging to HCTDs.<sup>7,8</sup> Genetic testing provides information that enables or supports an accurate diagnosis, which can help to define the medical course of action and, furthermore, to identify other at-risk family members.<sup>3</sup> Due to pronounced and still growing heterogeneity, conventional consecutive disease/ candidate gene screenings for the highly heterogeneous group of TAAD-related connective tissue disorders are both timeand cost-intensive; moreover, the high rate of patients negative for a causative sequence variant suggests that several risk genes are still unknown.<sup>3</sup> To shorten analysis time, minimize costs, and increase detection rates, next-generation sequencing (NGS)-based genetic testing strategies, either targeted NGS (tNGS) or exome sequencing (ES), for aortopathies and related disorders of connective tissue have been applied recently and, overall, described as a tool that overcomes problems intrinsic to consecutive disease/candidate gene screening.<sup>9-12</sup> Detection rates of causative sequence variants in 7 to 21 disease genes tested were between 3.9% and 35.3%, thus, in more than 60% of the patients, no causative variant was identified.<sup>9-16</sup> To date, more than 20 disease genes for aortopathies, e.g., LDS, MFS, and nonsyndromic TAAD, have been identified;<sup>3</sup> moreover, disease genes for several HCTDs with facultative cardiovascular manifestations, such as congenital contractural arachnodactyly (CCA), cutis laxa type IB, and arterial tortuosity syndrome, have been established.<sup>1</sup> With a special focus on aortopathies and vascular manifestations, we selected 32 known disease genes and genetically tested a mixed cohort of 199 patients with the clinical diagnosis of hereditary aortopathy and/or related disorder of connective tissue by using NGS technology. Here we report on our experiences with this NGS-based molecular test as an obligate part of the diagnostic clarification of this group of disorders over a twoyear period.

## MATERIALS AND METHODS

#### Study cohort

We recruited patients in various medical centers in Germany (described in Supplementary Materials and Methods). Inclusion criteria were as follows: (1) Clinical features of the probands were suggestive of MFS, LDS, EDS, CCA, syndromic/ nonsyndromic TAAD, or an unspecified heritable disorder of connective tissue with or without vascular involvement, i.e., HCTD. (2) Clinical data and samples for all individuals were obtained with informed consent of the patients' parents/legal guardians or the patients themselves according to the Declaration of Helsinki and the national legal regulations (e.g., the German Genetic Diagnosis Act [GenDG]). In total, we obtained blood samples from 199 consecutive, unrelated patients with a mean age of 42 ( $\pm 15.6$  SD) years from January 2016 to December 2017. Characteristics of the study group including initial diagnoses, associated structural abnormalities, family history, etc. are described in the Supplementary Materials and Methods and summarized in Table S1.

### **Genetic testing**

Selection criteria for the 32 genes and strength of gene-disease associations are outlined in Supplementary Materials and Methods and Table S2, respectively. Detailed information on targeted next-generation sequencing, exome sequencing, Sanger sequencing, multiplex ligation-dependent probe amplification (MLPA), transcript analysis, and statistical analysis are given in the Supplementary Materials and Methods and in Tables S2 and S3.

# Variant prioritization, pathogenicity assignment and refinement

Synonymous, missense, and nonsense variants; coding indels; and intronic alterations at exon-intron boundaries ranging from -40 to +40 were included in our analysis. HCTDs with vascular involvement are relatively late-onset diseases and unlikely to have a huge effect on fitness and hence allele frequencies; therefore, variants with minor allele frequencies  $(MAF) \ge$  than the respective disease prevalence were excluded (Table S4). Variants passing these filters were assigned to pathogenicity classes according the American College of Medical Genetics and Genomics and the Association for Molecular Pathology (ACMG/AMP) standards and guidelines: pathogenic variant (PV), likely pathogenic variant (LPV), variant of uncertain significance (VUS), and likely benign variant (LBV).<sup>17,18</sup> Population and disease-specific databases, in silico predictive algorithms, as well as additional lines of evidence used for defining accurate classification criteria for variants are described in the Supplementary Materials and Methods. Variants with discordant classifications (d.c.) among this study and database on the relationships between human variations and phenotypes (ClinVar)<sup>19</sup> or the Human Gene Mutation Database (HGMD)<sup>20</sup> entries as well as variants with classifications having been modified after passing the ACMG/AMP classification system were

categorized as refined variants (Table S5). Reasons for refinement are specified.

## RESULTS

## Identified variants by classification

We analyzed 199 individuals with hereditary aortopathy or related connective tissue disorder. The majority of patients had vascular complications such as TAAD, carotid artery aneurysm and dissection (CAAD), abdominal aortic aneurysm (AAA), or intracranial aneurysms (IA). One hundred fifty-two patients were tested by tNGS and 47 were screened by ES. In total we found 111 variants with MAF < the respective disease prevalence (Table S4) in 24 of 32 genes analyzed (Table S2). No variants were detected in COL1A1, COL4A5, EFEMP2, MAT2A, MFAP5, PLOD1, SLC2A10, and SMAD4. According to ACMG/AMP guidelines for variant classification,<sup>17,18</sup> we defined 15 pathogenic variants (PV), 20 likely pathogenic variants (LPV), and 72 variants of uncertain significance (VUS) (in total 107 reportable variants) (Table 1, S6, and S7). Details on criteria for classifying variants are given in Table 1 and S5-S8; the types of variants identified are summarized in the Supplementary Results.

Four sequence alterations were classified as likely benign (LBV) and excluded from further data evaluation (Table S8). Eleven of the 15 PV were already annotated as (likely) diseasecausing variants or (likely) pathogenic in HGMD or ClinVar, the other 4 PV were novel (Fig. 1). Of the variants classified as LPV, 11 were already reported, and 9 were novel (Fig. 1). The majority of PV/LPV were detected in *FBN1* (23 variants) followed by *SMAD3* (5 variants), *TGFBR1* (2 variants) and *FBN2*, *COL3A1*, *LOX*, *MYH11*, and *TGFBR1* (1 variant each) (Fig. 1). Of the 72 VUS, 25 were novel and 47 were already annotated in HGMD, ClinVar, or gnomAD; most VUS were identified in *DCHS1* (12), *COL3A1* (7), *NOTCH1* (7), *FBN2* (6), and *FBN1* (5) (Fig. 1).

For the novel variant FBN1 c.1589-14A>G (subject 14), we experimentally analyzed the impact on precursor messenger RNA (pre-mRNA) splicing because activation of a cryptic splice acceptor site in intron 13 was predicted (Table 1). We identified FBN1 transcripts with a 13-nucleotide 5'-expansion of exon 14 specifically in complementary DNA (cDNA) from patient 14, which results in a frameshift and a premature stop codon (p.Ile531Phefs\*6) (Figure S1). Accordingly, FBN1 c.1589–14A>G was classified as LP (Table 1). In total, impact on splicing was predicted for 30 variants, which then were considered for variant classification according Richards et al. (Table 1 and S5-S8).<sup>17</sup> For the classification of seven variants (i.e., by assigning BS4/PP1 attributes),<sup>17</sup> we determined familial segregation (Figure S2). ACTA2 c.420G>A did not cosegregate with the disease in the family of subject 95 (Figure S2A). There was also no cosegregation of the COL3A1 variant c.805G>C with the disease in the family of subject 151, however, FBN2 c.1610A>G did cosegregate with the disease (Figure S2B). Affected but not healthy family members of subject 124 share the heterozygous FBN1 c.1211C>G variant (Figure S2C). Results for the remaining variants were not informative and, therefore, not included in variant classification (Figures S2D and S2E).

We screened PV/LPV-negative patients with a clinical diagnosis of MFS, LDS 1/2, and vascular EDS for copynumber variations in *FBN1*, *TGFBR1*, *TGFBR2*, and *COL3A1*, respectively, by MLPA; no alteration was detected.

#### LOX variants

We uncovered LOX variants in two patients by retrospective analysis of available ES data: the 23-year-old patient 188 with negative family history, aortic aneurysm, and dissection but negative for syndromic features, has the LPV LOX c.125G>A (p.Trp42<sup>\*</sup>); in addition this patient carries a VUS in FBN2 (Table 1 and S6). Subject 13, 48 years old and with negative family history, initially was diagnosed with LDS based on an aortic aneurysm, translucent skin, easy bruising, hernia, and recurrent injuries of ankle ligaments; he underwent an ascending aorta replacement with reconstruction of the native aortic valve and reimplantation of the coronary arteries. This individual carries LOX c.995A>G (p.Tyr332Cys), which was classified as a VUS (PM1+PM2 +BP4). Taken together, these two cases demonstrate the advantage of ES over tNGS because of the possibility to reanalyze existing ES data of mutation-negative patients and evaluate newly reported disease-associated genes; furthermore, ES data can be used to identify genes not yet associated with TAAD/HCTD.

#### Variant refinement

By using ACMG guidelines we obtained 12 and 14 discordant variant classifications for in total 21 variants compared with HGMD and ClinVar, respectively (Table S5). Ten HGMD classifications were downgraded (7 from DM to LPV, 1 from DM to VUS and 2 from DM[?] to VUS), and 2 were upgraded from DM(?) to PV (Table S5). Four ClinVar classifications were downgraded (3 from P to LPV and 1 from VUS to LBV), and 10 were upgraded from LB and VUS to VUS and LPV/ PV, respectively (Table S5).

We also refined two classifications determined by ACMG guidelines. First, *FBN2* c.1610A>G identified in subject 151 was reclassified from VUS (PM1+PP3) to LPV (PM1 +PP1<sub>moderate</sub>+PP3+PP4, Table 1) because it cosegregates with the disease in four affected family members (Figure S2B) and the differential diagnosis for this patient was CCA. Second, *LOX* c.125G>A (p.Trp42\*) was initially classified as VUS (PM2). However, this variant has been identified in two affected family members with familial TAAD; moreover another nonsense variant (p.Gly202\*) has been described in a patient with familial TAAD.<sup>21</sup> Thus, although not yet established, evidence for loss-of-function (LOF) pathogenicity is available,<sup>22</sup> and we refined the *LOX* c.125G>A to be LP (PVS1<sub>strong</sub>+PM2).

Taken together, variant refinement resulted in up- or downgrading of 22 variants; thus, 19.8% of all detected variants (22 refined variants/111 variants in total) were reclassified.

CARD     Control     C	c. notation p. notation	Classifications: HGMD/ClinVar ACMG	gnomAD MAF (het/hom/∑)	Pathogenicity scores: REVEL/M-CAP/ClinPred	Impact on splicing (tool)	Subject (concomitant variant <sub>GENE</sub> )	Initial and differential diagnoses; family history (FH)
$ \begin{array}{llllllllllllllllllllllllllllllllllll$	COL3A1; misZ=4.40, p	oLl=1.00, disease prevalence 1:50,000 (0.002%)					
	c.7/3G>C p.Gly258Ala	n.l./n.l. LPVpn1+pw2+pp3+pp4 <sup>a</sup>	0	0.977/0.937/0.997	n.d.	146	HC ID, EDS (VASC) FH n.d.
$ \begin{array}{llllllllllllllllllllllllllllllllllll$	FBN1; misZ=5.45, pLI=	=1.00; disease prevalence 1:7500 (0.013%) DM/n Cvc102Tvr//n l					MES
$ \begin{array}{llllllllllllllllllllllllllllllllllll$	p.Cys102Arg	LPV.pn1+.pm2+.pm2+.pp2+.pp3+.pp4	0	0.932/0.801/0.995	n.d.	137	FH neg.
$ \begin{array}{llllllllllllllllllllllllllllllllllll$	c.640G>A p.Gly214Ser	DM, DM(p.Gly214Arg), DM(p.Gly214Asn)/P	0	0.919/0.807/0.999	n.d.	62	TAAD FH neg.
$ \begin{array}{cccccccccccccccccccccccccccccccccccc$	c.718C>T p.Arg240Cys	r v ps1+pM1+pM2+pp3+pp2 DM <sup>d.c.</sup> , DM(p.Arg240His/p <sup>d.c.</sup> LPV <sub>ps1+pM2+pp2+pp3+pp4</sub>	0	0.829/0.293/0.998	n.d.	141	MFS FH n.d.
$ \begin{array}{cccc} \mbox{Non-1} & Non-$	c.974_983del p.Gly325Alafs <sup>a</sup> 2	n.l./n.l. PVpvs1+pn2+pp4	0	n.a./n.a./n.a.	n.d.	53	MFS FH n.d.
	c. 1570dupA p.Thr524Asnfs <sup>a</sup> 9	DM/P-LP PVpv51+P54+PM2+PP4	0	n.a./n.a./n.a.	n.d.	130	MFS FH pos. (MFS)
$ \begin{array}{llllllllllllllllllllllllllllllllllll$	c.1589–14A>G p.Ile531Phefs <sup>a</sup> 6	n.l./n.l. LPV <sub>PS3+PM2+PP3+PP4</sub>	0	n.a./n.a./n.a.	Cryptic acceptor gain (HSF, MaxEnt; exp. conf.)	14 (+VUS <sub>NOTCH1</sub> )	MFS FH pos. (TAAD)
$ \begin{array}{llllllllllllllllllllllllllllllllllll$	c.2242T>C p.Cys748Arg	DM?, DM(p.Cys748Tyr)/LP LPV <sub>PM1+PM2+PM5+PP2+PP3+PP4</sub>	0	0.984/0.965/1.000	n.d.	133	MFS FH neg.
$ \begin{array}{llllllllllllllllllllllllllllllllllll$	c.2557T>C p.Cys853Arg	DM, DM(p.Cys853Ser)/n.l. PV <sub>P51+PM1+PM2+PP2+PP3+PP4</sub> b	0	0.953/0.893/0.999	n.d.	162 (+VUS <sub>NOTCH1</sub> )	MFS FH pos. (MFS)
$ \begin{array}{llllllllllllllllllllllllllllllllllll$	c.3012C>A p.Tyr1004 <sup>a</sup>	DM/P PVevs1+pM2+pp4	0	n.a./n.a./n.a.	n.d.	161 (+VUS <sub>MYH11</sub> )	MFS, LDS FH pos. (MFS, LDS)
$ \begin{array}{llllllllllllllllllllllllllllllllllll$	c.3332G>A p.Cys1111Tyr	DM, DM(p.Cys1111Arg)/n.l. PV <sub>PS1+PM1+PM2+PP2+PP3+PP4</sub>	0	0.877/0.556/1.000	n.d.	41	MFS FH n.d.
	c.3599A>T p.Glu1200Val	DM(p.Glu1200Gly)/n.l. LPV <sub>PM1+PM2+PM5+PP2+PP3+PP4</sub>	0	0.962/0.903/0.999	n.d.	74	MFS FH n.d.
$ \begin{array}{llllllllllllllllllllllllllllllllllll$	c.3712G>A p.Asp1238Asn	DM? <sup>d.c.</sup> , DM(p.Asp1238Gly)/P PV <sub>P51+PM1+PM2+PP3+PP4</sub>	0	0.895/0.686/0.997	n.d.	122	HCTD, MFS FH pos. (HCTD)
$ \begin{array}{cccccccccccccccccccccccccccccccccccc$	c.3937G>A p.Gly1313Ser	DM <sup>d.c.</sup> /n.l. LPV <sub>PS1mod.+PM1+PP2+PP3</sub> <sup>c</sup>	0.0003981% (1/0/251176)	0.827/0.719/0.780	n.d.	127 (+LPV <sub>FBN1</sub> )	TAAD FH neg.
5     П.М.Н. Vrvs:+икz+теч     0     п.а./п.а./п.а.     42       2     Wrvs:+икz+теч     42       2     Wrvs:+икz+теч     6       2     Wrvs:+икz+теч     6       2     Wrvs:+икz+теч     6       2     Wrvs:+икz+теч     127 (+UPV <sub>BN</sub> )       1     DM(p.Arg1832Pro)/Ud <sup>4C</sup> 0     0.793/0385%     0.793/0385%     0.793/0385%       1     DM(p.Arg1832Pro)/Ud <sup>4C</sup> 0     0.003185%     0.793/0385%     0.793/0385%     0.793/0385%       1     DM(p.Arg1832Pro)/Ud <sup>4C</sup> 0     0     0.03135%     0.793/0385%     0.793/0385%     0.793/0385%       1     DM(p.Arg1832Pro)/Ud <sup>4C</sup> 0     0     0.10     0.10     1.27 (+UPV <sub>BN</sub> )       1     DM(p.Arg2129Va)/Ud <sup>4C</sup> 0     0     0.793/0380     0.10     1.27 (+UPV <sub>BN</sub> )       1     DM(p.Arg2129Va)/Ud <sup>4C</sup> 0     0     0.737(930)     0.10     1.27 (+UPV <sub>BN</sub> )       1     DM(p.Arg12Frankz+Frankz+Frankz+Frankz+Frankz+Frankz+Frankz     0     0.10     1.27 (+UV <sub>BN</sub> )       1	c.4036T>G p.Phe1346Val	DM, DM(p.Phe1346Leu,Cys)/n.l. PV <sub>P51+PM1+PM2+PP3+PP4</sub>	0	0.984/0.890/0.995	n.d.	172	MFS FH neg.
DMM.L.     DMM.L.     Communication     0     п.а./п.а./п.а.     Acceptor loss (HSF, Matchine)     69       PVersit=NRL+PRA     DVersit=NRL+PRA     0003185%     0.733/03395     n.a./n.a.     Matchine     69       IP Versit=NRL+PRAS     0003185%     0.733/03395     n.a./n.a.     126 (+UVS <sub>FRAV</sub> )     127 (+IPV <sub>FRAV</sub> )       IP Versit=NRL+PRAS     0     n.a./n.a.     n.a./n.a.     n.a./n.a.     126 (+UVS <sub>FRAV</sub> )       IP Versit=NRL+PRAS     0     0     0.557/0.624/0.930     n.d.     126 (+UVS <sub>FRAV</sub> )       IP Versit=NRL+PRAS     0     0     0.857/0.624/0.930     n.d.     126 (+UVS <sub>FRAV</sub> )       IP Versit=NRL+PRAS     0     0     0.857/0.624/0.930     n.d.     126 (+UVS <sub>FRAV</sub> )       IP Versit=NRL+PRAS     0     0     0.857/0.624/0.930     n.d.     126 (+VUS <sub>FRAV</sub> )       IP Motion State     PVersit=NRL+PRAS     0     0     0.857/0.624/0.930     n.d.       IP Motion State     PVersit=NRL+PRAS     0     0.952/0.966/0.999     n.d.     126 (+VUS <sub>FRAV</sub> )       IP Motion State     PVersit=NRL+PRAS     0	c.4781delG p.Gly1594Valfs <sup>a</sup> 46	n.1./n.1. PVpvs1+pm2+pp4	0	n.a./n.a./n.a.	n.d.	42	MFS FH n.d.
DM(p.Arg1832Pro/VUS <sup>d.c.</sup> 0.003185%     0.793/0.387/0.996     n.d.     127 (+LPV <sub>PBW</sub> )       1     U/M.     U/M.     U/M.     126 (+VP <sub>PBW</sub> )     126 (+VP <sub>PBW</sub> )       1     PUNSI:HM2+PP24     0     0.793/0.387/0.996     n.d.     126 (+VP <sub>PBW</sub> )       1     PUNSI:HM2+PP4     0     0     n.a./n.a.     n.d.     126 (+VDSpM2)       1     PUNSI:HM2+PP4     0     0     0.857/0.624/0.930     n.d.     99       1     PUNSI:HM2+PP4     0     0     0.857/0.624/0.930     n.d.     99       1     PUNSI:HM2+PP4     0     0     0.857/0.624/0.930     n.d.     24       1     PUNSI:HM2+PP4     0     0     0.990/0.901/0.00     1.d.     24       PUNSI:HM1+PM2+PP3     0     0     0.990/0.901/0.00     n.d.     27       DM, DM(0.CVS2565Phe/PML)     0     0.990/0.901/0.00     n.d.     27       PVS1:HM1+PM2+PP3     0     0.990/0.901/0.00     n.d.     27       DMSC.PLP3     0     0.990/0.901/0.00     n.d.     2	c.5066–1G>A p.?	DM/n.l. PVpvs1+pm2+pp4	0	n.a./n.a./n.a.	Acceptor loss (HSF, MaxEnt)	69	MFS FH pos. (MFS)
1     n.l.n.l. PV <sub>PX51+PM2+PM</sub> 0     n.a./n.a./n.a.     n.d.     126 (+VUS <sub>5M27</sub> PV <sub>PX51+PM2+PM3</sub> 0     0.857/0.624/0.930     n.d.     99       PV <sub>PX51+PM2+PM3</sub> 0     0.857/0.624/0.930     n.d.     99       PV <sub>PX51+PM2+PM3</sub> 0     0.300/0.940/1.000     n.d.     99       PV <sub>PX51+PM2+PM3</sub> 0     0.990/0.940/1.000     n.d.     24       PV <sub>PX51+PM2+PM3</sub> 0     0.990/0.940/1.000     n.d.     21       DM, DM(p.Cy52528Phe,Try/n.l.     0     0.990/0.940/1.000     n.d.     27       DM, DM(p.Cy52558Phe/n.l.     0     0.990/0.940/1.000     n.d.     27       DM4 C.P.L.P     DM(p.Cy52565Phe/n.l.     0     0.990/0.940/0.0383     n.d.     27       DM4 C.P.L.P     DM4 C.P.L.P     0.0001594%     0.642/0.040/0.383 <t< td=""><td>c.5495G&gt;A p.Arg1832His</td><td>DM(p.Arg1832Pro)/VUS<sup>d.c.</sup> LPV<sub>PM1+PM5+PP2+PP3</sub></td><td>0.003185% (1/0/31398)</td><td>0.793/0.387/0.996</td><td>n.d.</td><td>127 (+LPV<sub>FBN1</sub>)</td><td>TAAD FH neg.</td></t<>	c.5495G>A p.Arg1832His	DM(p.Arg1832Pro)/VUS <sup>d.c.</sup> LPV <sub>PM1+PM5+PP2+PP3</sub>	0.003185% (1/0/31398)	0.793/0.387/0.996	n.d.	127 (+LPV <sub>FBN1</sub> )	TAAD FH neg.
DM(p.Asp2129Val)WUS <sup>d.c</sup> 0     0.857/0.624/0.930     n.d.     99       L <sup>PP</sup> PMI+FM2+PP3+PP4     N.J.A.I.     0     0.857/0.624/0.930     n.d.     99       L <sup>PP</sup> PMI+FM2+PP3+PP4     D.M.     Millor     54     54       DM, DM(p.CyS228DPb <sub>b</sub> Tyr)n.I.     0     0.990/0.940/1.000     n.d.     91 (+VUS <sub>FBM</sub> )       DM, DM(p.CyS2565Phe/n.I.     0     0.952/0.960/0.999     n.d.     27       DM, DM(p.CyS2565Phe/n.I.     0     0.952/0.960/0.999     n.d.     27       DM, DM(p.CyS2565Phe/n.I.     0     0.952/0.960/0.393     n.d.     27       DM, DM(p.CyS2565Phe/n.I.     0     0.952/0.960/0.393     n.d.     27       DM, DM(p.CyS2565Phe/n.I.     0     0.952/0.960/0.393     n.d.     27       DM ac.PLP     0.001594%     0.642/0.040/0.383     n.d.     27  <	c.5905delA p.Arg1969Glyfs <sup>a</sup> 11	n.1./n.1. PVpvs1+pm2+pp4	0	n.a./n.a./n.a.	.p.u	126 (+VUS <sub>FBN2</sub> , +VUS <sub>NOTCH1</sub> )	MFS FH pos. (MFS)
n.l/n.l.     54       PVersi+PM2+PM2     0     n.a/n.a/n.a.     0     91 (+VU5 <sub>R2M1</sub> )     91 (+VU5 <sub>R2M1</sub> )       DM, DM(p.Cy5258Phe,TY/n.l.     0     0.990/0.940/1.000     n.d.     91 (+VU5 <sub>R2M1</sub> )       DM, DM(p.Cy52565Phe/TY/n.l.     0     0.990/0.940/1.000     n.d.     91 (+VU5 <sub>R2M1</sub> )       DM, DM(p.Cy52565Phe/TY/n.l.     0     0.952/0.960/0.999     n.d.     27       DM <sup>4/C</sup> , PL     0     0.001594%     0.642/0.040/0.383     n.d.     119       DM <sup>4/C</sup> , PL     0     0.001594%     0.642/0.040/0.383     n.d.     119       DM <sup>4/C</sup> , PL     1     0     0.001594%     0.642/0.040/0.383     n.d.     119       DM <sup>4/C</sup> , PL     1     0     0.001594%     0.642/0.040/0.383     n.d.     119       DM <sup>4/C</sup> , PL     1     0     0.01524%     0.642/0.040/0.383     n.d.     119       DM <sup>4/C</sup> , PL     1     1     1     1     119     1	c.6386A>G p.Asp2129Gly	DM(p.Asp2129Val)//US <sup>d.c.</sup> L <sup>PV</sup> PM1+PM2+PM5+PP2+PP3+PP4	0	0.857/0.624/0.930	n.d.	66	MFS FH pos. (MFS)
0     0.990/0.940/1.000     n.d.     91 (+VUS <sub>FBV1</sub> )       0     0.952/0.960/0.999     n.d.     27       0     0.952/0.960/0.383     n.d.     119       0     0.001703%     0.917/0.249/0.995     n.d.       0     0.007103%     0.917/0.249/0.995     n.d.     151 (+VUS <sub>COL341</sub> )	c.6613dupG p.Glu2205Glyfs <sup>a</sup> 5	n.l./n.l. PV <sub>PV51+PM2+PP4</sub>	0	n.a./n.a./n.a.	n.d.	54	MFS FH pos. (MFS)
0     0.952/0.960/0.999     n.d.     27       0.001594%     0.642/0.040/0.383     n.d.     119       0.0007103%     0.917/0.249/0.995     n.d.     151 (+VUScot341)	c.7582T>C p.Cys2528Arg	DM, DM(p.Cys2528Phe,Tyr)/n.l. PV <sub>P51+PM1+PM2+PP2+PP3</sub>	0	0.990/0.940/1.000	n.d.	91 (+VUS <sub>FBN1</sub> )	TAAD FH neg.
0.001594% 0.642/0.040/0.383 n.d. 119 (4/0/250918) 0.642/0.040/0.383 n.d. 151 (+VUS <sub>C0134</sub> ) 0.0007103% 0.917/0.249/0.995 n.d. 151 (+VUS <sub>C0134</sub> )	c.7694G>A p.Cys2565Tyr	DM, DM(p.Cys2565Phe)/n.l. PVps1+pM1+pM2+pp2+pp3+pp4	0	0.952/0.960/0.999	n.d.	27	MFS FH pos. (MFS)
0.0007103% 0.917/0.249/0.995 n.d. 151 (+VUS <sub>COL341</sub> )	c.7754T>C p.Ile2585Thr EBM2. mic7 1 00 m1	DM <sup>d.c.</sup> /P-LP LPV <sub>P51+PM1+PP2+PP3</sub> 1 00: dispatent 1:20 000 (0 0059/ )	0.001594% (4/0/250918)	0.642/0.040/0.383	n.d.	119	TAAD, MFS FH neg.
	c.1610A>G p.Asp537Gly	- 1.00, usease prevarine 1.20,000 (0.000 /0) n.1/n.1. LPVpM1+pp1mod.+pp3+pp4	0.0007103% (2/0/281554)	0.917/0.249/0.995	n.d.	151 (+VUS <sub>COL3A1</sub> )	HCTD, CCA FH pos. (HCTD, MFS)

c. notation p. notation	Classifications: HGMD/ClinVar ACMG	gnomAD MAF (het/hom/∑)	Pathogenicity scores: REVEL/M-CAP/ClinPred	Impact on splicing (tool)	Subject (concomitant variant <sub>GENE</sub> )	Initial and differential diagnoses; family history (FH)
LOX; misZ=0.81, pLI=(	LOX; misZ=0.81, pLI=0.99; disease prevalence 1:1000 (0.1%)					
c.125G>A p.Trp42 <sup>a</sup>	DM <sup>d.c.</sup> /pd.c. LPV <sub>PVS1strong+PM2</sub> d	0	n.a./n.a./n.a.	n.d.	188 (+VUS <sub>FBN2</sub> )	TAAD FH neg.
MYH11; misZ=1.54, pl	<i>MYH11</i> ; misZ=1.54, pLl=0.88; disease prevalence 1:1000 (0.1%)					
c.3787_3789delAAG p.Lvs1263del <sup>e</sup>	DM <sup>d.c.</sup> /VUS <sup>d.c.</sup>	0.004607%	ed/ed/ed		97 (+VUS <sub>MYLK</sub> )	TAAD FH pos. (TAAD)
<u>-</u>	LPVP54+PM4	(13/0/282182)		5	117	TAAD FH pos. (TAAD)
SMAD3; misZ=3.47, pl	<i>SMAD3</i> ; misZ=3.47, pLl=0.84; disease prevalence 1:1000 (0.1%)					
c.738_741dupGACA p.Phe248Aspfs <sup>a</sup> 64	n.l./n.l. LPV <sub>PVS1+PM2</sub>	0	n.a./n.a./n.a.	n.d.	153	TAAD FH pos. (TAAD)
c.803G>A p.Arg268His	DM? <sup>d.c.</sup> , DM(p.Arg268Leu)/VUS <sup>d.c.</sup> PV <sub>P54+PM1+PM2+PP2+PP3</sub>	0	0.987/0.631/1.000	n.d.	156	TAAD, MFS, LDS FH pos. (TAAD)
c.848T>A p.Val283Glu	n.l./n.l. LPV <sub>PM1+PM2+PP3</sub>	0	0.985/0.797/0.998	n.d.	142 (+VUS <sub>FBN1</sub> , +VUS <sub>NOTCH1</sub> , +LPV <sub>SMAD3</sub> )	HCTD, TAAD, SAH FH neg.
c.851A>G p.Glu284Gly	n.l./n.l. LPV <sub>PM1+PM2+PP3</sub>	0	0.979/0.728/0.997	n.d.	142 (+VUS <sub>FBN1</sub> , +VUS <sub>NOTCH1</sub> , +LPV <sub>SMAD3</sub> )	HCTD, TAAD, SAH FH neg.
c.1091A>G p.Tyr364Cys	DM <sup>d.c.</sup> NUS <sup>d.c.</sup> LPV <sub>P51+PM1+PM2+PP2</sub>	0	0.900/0.429/0.997	n.d.	135	TAAD FH n.d.
TGFBR1; misZ=2.90, pl	TGFBR1; misZ=2.90, pLI=0.83; disease prevalence 1:40,000 (0.0025%)					
c.575G>A p.Gly192Asp	n.l./n.l. LPVpм1+pм2+pp3	0	0.901/0.478/0.995	n.d.	131	EDS FH pos. (EDS)
c.1457T>C p.Leu486Ser	DM <sup>d.с.</sup> /л./. LPVpm1+pm2+pp3	0	0.815/0.149/0.995	.b.n	71	TAAD FH n.d.
TGFBR2; misZ=2.39, pl	TGFBR2; misZ=2.39, pLI=0.15; disease prevalence 1:40,000 (0.0025%)					
c.1639G>A p.Asp547Asn	п.I./p <sup>d.с.</sup> LPV <sub>PM1+P</sub> M2+PP3	0	0.463/0.069/0.999	n.d.	138 (+VUS <sub>DCH51</sub> )	TAAD FH neg.
Variants are listed by ger (misZ; intolerance to varia translation initiation codoi	Variants are listed by gene and were detected in 8/32 analyzed genes: COL3A1, FBN1, FBN2, LOX, MYH11, SMAD3, TGFBR1, and TGFBR2. For each gene, gnomAD constraint metrics (v2.1) including missense Z score (mis2; intolerance to variation) and probability of loss-of-function intolerance (pLI) score as well as the prevalence of relevant associated phenotypes (Table S4) are given. Nucleotide numbering uses +1 as the A of the ATG translation initiation codon in the reference, with the initiation codon as codon 1. Concomitant variants are indicated in the column "Subject" after the patient numbers in parentheses. HGMD variant categoriza-	3 <i>A1, FBN1, FBN2, LO</i> ) (pLl) score as well as th on as codon 1. Concor	(, MYH11, SMAD3, TGFBR1, ie prevalence of relevant asso nitant variants are indicated in	and <i>TGFBR2</i> . For each gene, i ciated phenotypes (Table 54) a the column "Subject" after th	gnomAD constraint metric re given. Nucleotide numb ne patient numbers in pare	COL3A1, FBN1, FBN2, LOX, MYH11, SMAD3, TGFBR1, and TGFBR2. For each gene, gnomAD constraint metrics (v2.1) including missense Z score nee (pLI) score as well as the prevalence of relevant associated phenotypes (Table S4) are given. Nucleotide numbering uses +1 as the A of the ATG codon as codon 1. Concomitant variants are indicated in the column "Subject" after the patient numbers in parentheses. HGMD variant categoriza-

1.00 % DFP disease-associated polymorphism with supporting functional evidence, DM disease causing mutation, DM? likely disease causing mutation, DP disease-associated polymorphism, FP in vitro/laboratory or in vivo functional polymorphism, R retired entry. Variants that affect the same amino acid are given in parentheses. ClinVar clinical significance values: B benign, LB likely benign, LP likely pathogenic, VUS variant of functional polymorpnism, K retired entry. Variants that affect the same amino acid are given in parentheses. This study's variant classification: LBV likely benign variant, LPV likely pathogenic uncertain significance or with conflicting interpretations of pathogenicity. Variants that affect the same amino acid are given in parentheses. This study's variant classification: LBV likely benign variant, LPV likely pathogenic uncertain significance or with conflicting interpretations of pathogenic returns mathematican in partner and the same amino acid are given in parentheses. This study's variant classification: LBV likely benign variant, LPV likely pathogenic uncertain significance or with conflicting interpretations of pathogenic returns mathematican uncertain science are uncertained as unce VUS variant of uncertain significance. Pathogenic criteria were weighted as very strong (PVS1), strong (PS1–4), moderate (PM1–6), or supporting (PP1–4); benign criteria were weighted stand-alone (BA1), strong (BS1–4), or supporting (BP1–5). tion:

Clin Pred Prediction Tool to Identify Disease-Relevant Nonsynonymous Single-Nucleotide Variants, M-CAP Mendelian Clinically Applicable Pathogenicity, REVEL Rare Exome Variant Ensemble Learner. Pathogenicity thresholds: gromAD Genome Aggregation Database (v2.1), het/hom/2 number of heterozygous carriers/number of homozygous carriers/number of analyzed alleles, MAF minor allele frequency (total population).

HSF Human Splicing Finder, MaxEntScan Maximum Entropy Modeling of Short Sequence Motifs, NetGene2 neural network predictions of splice sites. REVEL (≥0.5), M-CAP (≥0.025), ClinPred (≥0.5).

congenital contractural arachnodactyly, EDS Ehlers-Danlos syndrome, HCTD hereditary connective tissue disorder, LDS Loeys-Dietz syndrome, MFS Marfan syndrome, SAH subarachnoid hemorrhage, TAAD thoracic SCA

Family history: FH n.d. family history not determined, FH neg. negative family history, FH pos. positive family history. In case of a positive family history: a suspected or confirmed diagnosis for the additional affected family aortic aneurysm and dissection, VASC vascular type.

member(s) is given in parentheses.

Further abbreviations: d.c. discordant classification, exp. conf. experimentally confirmed, mod. moderate, n.a. not applicable, n.d. not determined, n.l. not listed.

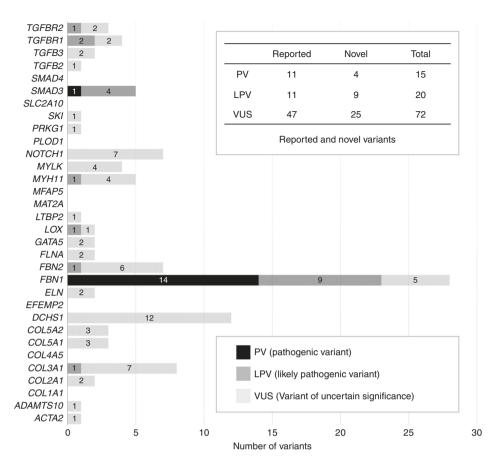
COL3A1 c.773G>C (p.Gly25RAla) was classified as LP based on PM1 (the change affects the glycine residue of a Gly-X-Y collagen triple helix motif, and the majority of pathogenic variants in COL3A1 are heterozygous missense substitutions affecting one of the glycine residues of the [Gly-X-Y]<sub>343</sub> repeat region, acting as dominant negative variants)<sup>35,36</sup> +PM2+PP3+PP4 (the patient's phenotype strongly suggested vascular Ehlers-Danlos syndrome).

<sup>PS1</sup> was assigned to this variant because this missense change and a different missense change affecting the same amino acid are annotated as DM in HGMD. Strength of PS1 was decreased to moderate ( $PS1_{mod}$ ), because this variant (annotated as DM in HGMD) has been associated with an alternative phenotype, i.e., severe adolescent idiopathic scoliosis.<sup>37</sup> Variant was reclassified after it passed ACMG classification system (see text for details).

HGMD variant is annotated as c.3766\_3768delAAG, which corresponds to MYH11 isoform 1; the variant c.3787\_3789delAAG corresponds to the longest MYH11 isoform 2.

## ARTICLE

Table 1 continued



**Fig. 1 Summary of reportable variants identified by gene.** The distribution of reportable variants including pathogenic variants (PVs), likely pathogenic variants (LPVs), and variants of uncertain significance (VUS) identified in genes associated with hereditary aortopathies and related disorders of connective tissue across the Hamburg cohort of 199 individuals is shown. Numbers of PV, LPV, and VUS per gene are given. Among the 107 reportable variants, 15 were pathogenic (4 novel), 20 were likely pathogenic (9 of these novel), and 72 were VUS (25 previously unreported).

#### Identified variants by patients

In 118 individuals (59.3%) we did not identify reportable variants with MAFs less than the respective disease prevalence; 81/199 patients (40.7%) were positive for reportable variants. Several patients carry more than one PV, LPV, and/ or VUS, which explains the difference between the number of variants and the number of patients with reportable variants. Table S9 summarizes the distribution of reportable variants (PV, LPV, and VUS) by patient and the 25 individuals with more than one PV, LPV, or VUS are listed in Table S10. This data raises the question of the relevance of additional variants in the pathogenesis of HCTD.

Notably, four patients (14, 126, 142, and 162) had a variant in both *FBN1* and *NOTCH1* (Table S10), however, the phenotype of the four patients was neither atypical, extraordinarily severe, nor did the patients show a bicuspid aortic valve (clinical details are described in the Supplementary Results). Similarly, patients 97, 138, 151, 161, and 188 carry one VUS in addition to a PV/LPV (Table S10); the clinical manifestations in the five patients were not significantly different from the typical clinical spectrum of the respective disorder (clinical details are described in Supplementary Results). Summarized, our data suggest that concomitant reportable variants had a minor or even no contribution to the clinical outcome of the affected individuals.

#### **Diagnostic yields**

We identified at least one PV or LPV in 34 patients of our cohort resulting in an overall diagnostic yield of 17.1% (34/199 patients) (Table 2).

The highest diagnostic yield, 29.8% (17/57), was obtained in the subgroup of patients with the clinical diagnosis MFS (Table 2). In 16.9% (12/71) and 6.6% (4/61) of patients diagnosed with TAAD and HCTD, respectively, a PV/LPV was found (Table 2). The diagnostic yield was not significantly increased in patients with a positive family history compared with those with a negative family history (18.2% [16/88] vs. 13.9% [10/72]; p = 0.523) (Table 2). Next, we compared the initial clinical diagnoses between patients with and without PV/ LPV in at least one of the analyzed 32 genes. The frequency of the initial diagnosis MFS was significantly higher in the PV/ LPV-positive (17/34) compared with the PV/LPV-negative (40/ 165) cohort (50.0% vs. 24.2%; *p* = 0.0059) (Table 2). In contrast, the initial diagnoses HCTD and TAAD were not increased in the PV/LPV-positive subcohort (Table 2). Data and calculations for diagnostic yields considering VUS in addition to PV/LPV

#### Table 2 Diagnostic yields

Initial diagnosis	Number of patients	Absolute and relative fre	quencies of patients	
or family history		with P/LP variant (in the total cohort)	with P/LP variant (in this subcohort)	without P/LP variant (in this subcohort)
HCTD	61	4/61 (6.6%)	4/34 (11.8%)	57/165 (34.6%)
TAAD	71	12/71 (16.9%)	12/34 (35.3%)	59/165 (35.8%)
MFS	57	17/57 (29.8%)	17/34 (50.0%)	40/165 (24.2%)
EDS	6	1/6 (16.7%)	1/34 (2.9%)	5/165 (3.0%)
LDS	3	0/3 (0%)	0/34 (0%)	3/165 (1.8%)
CCA	1	0/1 (0%)	0/34 (0%)	1/165 (0.6%)
FH pos.	88	16/88 (18.2%)	16/34 (47.1%)	72/165 (43.6%)
FH neg.	72	10/72 (13.9%)	10/34 (29.4%)	62/165 (37.6%)
FH n.d.	39	8/39 (20.5%)	8/34 (23.5%)	31/165 (18.8%)
Totals	199 (100%)	34/199 (17.1%)	34/34 (100%)	165/165 (100%)

Absolute and relative frequencies of initial diagnosis and family history are given for the entire cohort of 199 patients and for the subgroups with and without P/LP variant in at least 1 of the examined 32 genes.

CCA congenital contractural arachnodactyly, EDS Ehlers–Danlos syndrome, FH n.d. family history not determined, FH neg. negative family history, FH pos. positive family history, HCTD hereditary connective tissue disorder, LDS Loeys–Dietz syndrome, MFS Marfan syndrome, P/LP pathogenic/likely pathogenic, TAAD thoracic aortic aneurysm and dissection.

are presented in the Supplementary Results and Table S11. Taken together, there is a higher a priori probability to identify a causative variant in a patient with the clinical diagnosis MFS than TAAD and HCDT.

### DISCUSSION

### Diagnostic yield

Although the knowledge of the genetic causes for hereditary aortopathies and connective tissue disorders is constantly growing, many affected individuals still lack a genetic diagnosis. NGS-based multigene testing is currently regarded as the most powerful technology for genetic testing in clinical settings. In the cohort tested here by using NGS, 17.1% were positive for variants classified as P/LP. For individuals with the initial diagnosis MFS, vascular EDS, LDS, or CCA we identified at least one PV/LPV in 18/67 patients, thus the diagnostic yield for syndromic forms of HCTDs with vascular involvement is 26.9%. Several studies on NGS applications for the molecular diagnosis of TAAD have been reported.9-16 Taking into account only PV and LPV, the diagnostic yields were documented as 3.9% (21 genes in 102 patients analyzed),<sup>12</sup> 4.9% (15 genes in 1025 patients analyzed),<sup>13</sup> 8.1% (21 genes in 810 patients),<sup>16</sup> 10.3% (10 genes in 175 patients analyzed),<sup>11</sup> 13% (7 genes in 264 patients analyzed),<sup>15</sup> 18.6% (11 genes in 70 patients analyzed),<sup>14</sup> 27% (14 genes in 55 patients analyzed),<sup>10</sup> and 35.3% (10 genes in 51 patients analyzed).9 In our subcohort of 71 patients with the initial diagnosis of TAAD, 12 individuals had a PV or LPV resulting in a diagnostic yield of 16.9%. Given the relatively permeable inclusion criteria resulting in a phenotypically diverse study cohort, the total diagnostic yield of 17.1% is decent. It was suggested that differences of the diagnostic yields may be caused among others by differing inclusion criteria.9,10 Indeed, high or increased diagnostic yields were observed when patients with a positive family history, with early-onset aortic disease, or with a syndromic form of TAAD were included primarily.<sup>9,10,13</sup> In our study, however, the diagnostic yield was not increased in patients with a positive family history. Furthermore, in three previous studies the cohorts mainly included individuals with an unambiguous TAAD phenotype; however diagnostic yields were not consistent.<sup>12-14</sup> Factors influencing the diagnostic yield may be different variant classification rules. First, we used phenotype prevalences as MAF cutoffs, whereas rather lenient/arbitrary maximum MAFs of 0.1% or 0.5% have been considered in other studies.<sup>9,10,12,13</sup> Second, we interpreted variants according to the recommendations of the ACMG/AMP,<sup>17,18</sup> which was also done in previous studies.<sup>11,13,14</sup> A less stringent variant classification may result in a higher number of P/LP variants and, thereby, in an increased diagnostic yield.<sup>9,10</sup> Third, for several variants the pathogenicity predictions strongly differ depending on the tools used.<sup>23</sup> We used three ensemble scoring methods, REVEL, M-CAP, and ClinPred, each of them integrating scores from several individual tools (such as SIFT, PolyPhen, etc.); ensemble scoring methods constantly outperform individual tools.<sup>23-26</sup> In contrast, various combinations of pathogenicity prediction tools, mostly individual tools, have been applied in previous studies.9-16 Taken together, standardization of patient inclusion criteria, variant classification, and pathogenicity prediction may improve study comparability and comprehensiveness.

The relatively low diagnostic yields (<< to <40%) observed in all related studies with an average of 15.4% indicate that in many patients the disease is caused by factors that are at present unknown.<sup>9–16</sup> These can be genetic factors in coding or noncoding regions, which may exert their pathogenic potential in a mono-, oligo-, or polygenic manner. The latter inheritance pattern can include (rare, uncommon, and common) variants with relatively high MAF (e.g., >0.5%); those have not been considered in this study.

It has been assumed that inclusion of additional genes in the panels will increase diagnostic yields.<sup>9,11</sup> In our study the

number of analyzed genes was extended by at least 11 compared with previous studies,<sup>9-16</sup> however, diagnostic yield was not consistently increased; in detail, we identified only one LPV (in addition to 18 VUS) in previously not-analyzed genes. This suggests that, on the assumption of a monogenic trait, pathogenic variants in yet undescribed or unknown disease genes may explain only a small fraction of HCTD/TAAD each.<sup>3,27,28</sup> Clearly, nongenetic, i.e., environmental and lifestyle factors, may also account for a considerable number of cases with TAAD, and these certainly limit the diagnostic yield of genetic testing.

#### Clinical sensitivity and variant classification

Variant classification is a crucial step in NGS-based diagnostics that determines clinical sensitivity, i.e., the true positive rate. Re-evaluation of known variants will help to verify or falsify variant classifications, thereby uncovering more and more true genetic risk factors and improving clinical sensitivity. Refinement of variants in our study resulted in up- or downgrading of 22 variants based on ACMG/AMP classification criteria such as independent reports, segregation data, pathogenicity predictions, novel functional data, concomitant PV/LPV, transcript analysis, or the patient's phenotype. For the same reasons variants have been reclassified in other studies.<sup>11,13,14</sup> In this context, the consequences of variants on pre-mRNA splicing should be determined experimentally or at least by using prediction tools, as it is also recommended by the ACMG guidelines.<sup>17</sup> In addition to increasing the diagnostic yield, in our study the assessment of consequences on splicing particularly helped to discriminate between VUS and LBV. Taken together, there is and there will be no perfect a priori variant classification system; rather valid classifications strongly depend on continual a posteriori refinement of variants, and this in turn requires ongoing data sharing within the scientific community and incorporation of refined classification results into databases.

#### Genotype and phenotype

Similar to our results, pathogenic and likely pathogenic variants in ACTA2, COL1A1, COL3A1, COL5A2, FBN1, NOTCH1, MHY11, MYLK, SLC2A10, TGFBR1, and TGFBR2 were the most abundant in TAAD cohorts.<sup>10,12,13,16</sup> These results may reflect the well-described involvement of the reported genes in the pathogenesis of aortopathies and related disorders of connective tissue.<sup>29</sup> On the other hand, these genes (and their products) are better characterized than most of the other genes tested, which likely contributed to the predominance of PV/LPV in these genes. Thus, variants in other genes may be underestimated and underclassified due to limited available evidence for pathogenicity. For example, the LOX c.995A>G (p.Tyr332Cys) variant identified in patient 13 was classified as VUS based on ACMG guidelines.<sup>17</sup> It affects the LOX catalytic domain that covers all pathogenic missense variants reported to date.<sup>21,30</sup> This domain contains ten fully conserved cysteine residues, which all are involved in disulfide bonds and render extracellular LOX an unusually stable enzyme.<sup>31</sup> Thus, the change of tyrosine for a further cysteine has high potential to disturb the structure of the LOX catalytic domain, thereby, suggesting pathogenic consequences for the p.Tyr332Cys variant. Similarly, the pathogenicity of *FBN2* variants identified in our cohort may also be underestimated (details are outlined in the Supplementary Discussion).

In 17/57 patients with the clinical diagnosis of MFS, the identification of a PV/LPV in FBN1 confirmed the clinical diagnosis. We did not detect a PV/LPV in FBN1 in 40 (70.2%) of 57 individuals with the initial clinical diagnosis of MFS. In keeping with this, in a recent study 40% of patients with a PV/ LPV in FBN1 had a known or suspected clinical diagnosis of MFS.<sup>13</sup> These data strongly differ from detection rates for pathogenic FBN1 variants of >90% in patients fulfilling a clinical diagnosis of MFS based on the Ghent nosology.<sup>32,33</sup> In clinical practice MFS or MFS-like often is suspected for clinically ambiguous cases who have heritable aortopathy (i.e., TAAD) but do not obviously have MFS. Thus, the diagnostic pipeline should a priori include genetic analyses, thereby integrating the benefits of molecular genetics testing for the growing heterogeneity and pleiotropy of HCTD with vascular involvement. Given the highly variable expressivity and the marked phenotypic overlap observed in connective tissue disorders with vascular involvement, we and others conclude that a more lenient clinical evaluation of patients followed by an obligate stringent multigene analysis may help to avoid misdiagnoses.11

Notably, 25 individuals were found to carry more than one PV, LPV, or VUS. Concomitant variants in different genes in patients with TAAD have been reported previously, and the difficulty of variant classification and prioritization in these cases was highlighted.<sup>14,34</sup> Severe clinical manifestations have been described in three patients with concomitant variants in different genes;<sup>14</sup> however, it remained unclear whether multiple variants in different genes predict disease severity. Here, we describe four patients with reportable variants each in FBN1 and NOTCH1 but no atypical or severe clinical features. This suggests minor or no relevance of the identified NOTCH1 variants in the pathogenesis of the disease and/or a bias for overclassification of NOTCH1 variants, which may result from pronounced intolerance to variation/loss of function (missense Z Score = 3.95, pLI Score = 1.00) of NOTCH1.

#### Summary and conclusion

We applied NGS-based gene test approaches in a clinically relevant cohort of sporadic and familial individuals with hereditary aortopathies and related disorders and identified PV/LPV in 17.1% of patients. The highest diagnostic yield (29.8%) was obtained for patients with the clinical diagnosis of MFS. The lower detection rates for PV/LPV in patients with TAAD (16.9%) and HCTD (6.6%), and in parallel the higher incidence of VUS in these subcohorts suggest the existence of yet unknown disease loci and/or oligogenic/polygenic inheritance. In total 23.6% of PV/LPV-negative patients had VUS in

genes associated with connective tissue disorders; these variants have to be re-evaluated in the future. Ultimately, gene-specific functional assays, RNA splicing studies, and further genetic analyses such as genome sequencing and/or genetic burden tests are needed to provide further evidence for the pathogenicity of variants, thereby increasing both the diagnostic yield and the clinical sensitivity. For the patients' benefits, refining variant classifications will strongly support counseling of affected individuals as well as shaping therapeutic strategies.

### SUPPLEMENTARY INFORMATION

The online version of this article (https://doi.org/10.1038/s41436-019-0435-z) contains supplementary material, which is available to authorized users.

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### DISCLOSURE

The authors declare no conflicts of interest.

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