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RESEARCH ARTICLE

# Natural and Undetermined Sudden Death: Value of Post-Mortem Genetic Investigation

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# **Abstract**

## Background

Sudden unexplained death may be the first manifestation of an unknown inherited cardiac disease. Current genetic technologies may enable the unraveling of an etiology and the identification of relatives at risk. The aim of our study was to define the etiology of natural deaths, younger than 50 years of age, and to investigate whether genetic defects associated with cardiac diseases could provide a potential etiology for the unexplained cases.

#### **Methods and Findings**

Our cohort included a total of 789 consecutive cases (77.19% males) <50 years old (average 38.6±12.2 years old) who died suddenly from non-violent causes. A comprehensive autopsy was performed according to current forensic guidelines. During autopsy a cause of death was identified in most cases (81.1%), mainly due to cardiac alterations (56.87%). In unexplained cases, genetic analysis of the main genes associated with sudden cardiac death was performed using Next Generation Sequencing technology. Genetic analysis was performed in suspected inherited diseases (cardiomyopathy) and in unexplained death, with identification of potentially pathogenic variants in nearly 50% and 40% of samples, respectively.

### **Conclusions**

Cardiac disease is the most important cause of sudden death, especially after the age of 40. Close to 10% of cases may remain unexplained after a complete autopsy investigation.



these authors are articulated in the 'author contributions' section.

Competing Interests: The commercial funder Gendiag S.L provided support in the form of salaries for authors CF and RB. This does not alter our adherence to PLOS ONE policies on sharing data and materials. Molecular autopsy may provide an explanation for a significant part of these unexplained cases. Identification of genetic variations enables genetic counseling and undertaking of preventive measures in relatives at risk.

#### Introduction

Natural death defines the death primarily attributed to an illness or an internal malfunction of the body, and not directly influenced by external forces. The forensic pathologists can straightforwardly identify the cause of natural death when macroscopic investigations are conclusive [1]. However, when a macroscopic cause is not evident, the final identification of causality can become tedious and complicated. Despite comprehensive macroscopic, microscopic as well as toxicological investigation, around 5%-10% of cases will remain unexplained and will be classified as sudden unexpected deaths (SUD), often defined in the report as *death from a supposed arrhythmia* [2, 3]. In the young population, this percentage may increase up to 30%-50% [4–6]. Even if the cause of death remains unanswered after a thorough forensic investigation, the legal work is usually concluded. However, from the medical standpoint, an unidentified etiology conveys dangerous clinical implications; these unexplained deaths may be caused by an inherited cardiac disease, which potentially leaves family members at risk.

In a simplistic classification, deaths caused by cardiac genetic alterations may affect two different disease groups, channelopathies and cardiomyopathies [7]. It is estimated that 10% to 25% of SUD in the adult, and up to one-third in infantile and juvenile SUD, may be explained by cardiac channelopathies [8–11]. These channelopathies include mainly Long QT syndrome (LQTS), Short QT syndrome (SQTS), Catecholaminergic Polymorphic Ventricular Tachycardia (CPVT), and Brugada syndrome (BrS) [12]. In addition, pathogenic variations in genes encoding structural proteins are responsible for cardiomyopathies (Hypertrophic Cardiomyopathy (HCM), Dilated Cardiomyopathy (DCM), and Arrhythmogenic Cardiomyopathy (AC), among others). These cardiomyopathies will usually present anatomo-morphological changes in the cardiac tissue, which can be diagnosed at autopsy [13], but recent reports have suggested that in infants they could also be potentially responsible for sudden death in the structurally normal heart [14, 15].

Because SUD may be the first manifestation of an unknown inherited cardiac disease, the use of genetic testing, the so-called molecular autopsy, could be determinant in the discovery of causality, in the identification of genetic carriers in family members, and in the further adoption of preventive strategies [16, 17]. Despite that current forensic guidelines recommend molecular autopsy as part of routine protocol in SUD cases, this is seldom performed [18, 19]. This molecular investigation has been mainly limited to research projects, and usually constrained to the analysis of the most prevalent genes associated with channelopathies (*KCNQ1*, *KCNH2*, *SCN5A* and *RYR2*), leaving several potential candidate genes untested [20, 21]. With the advent of high-throughput genetic technologies, Next Generation Sequencing (NGS), massive genetic sequencing has become available [22]. Recent reports have shown that NGS analysis could become an important asset in post-mortem examination [23–27]. To date, only one comprehensive study has been performed to prove the value of genetic testing in natural death [28].

In the present work we have addressed this issue by performing a prospective full epidemiological analysis of sudden death in a correlative cohort of SUD victims younger than 50 years of age, referred for forensic investigation due to out of hospital natural death. The goal was to define the etiology of natural death in the young, and to investigate whether genetic defects could contribute to this event. To perform the genetic analysis we have taken advantage of a



custom-made resequencing panel. By including molecular diagnostic strategies, the ultimate goal of this work has been to develop a decision algorithm to better refine the forensic investigation, to assess the value of this powerful diagnostic tool in detecting a potential etiology, and to define which families would benefit from further clinical and genetic investigation.

#### Methods

Our project was initiated in 2012, in collaboration with Institut de Medicina Legal i Ciències Forenses de Catalunya (IMLCFC). The IMLCFC oversees and concentrates all SUD cases, which require forensic investigation. We have focused the project in those cases investigated by the pathologists in the Catalonia area (population of 7.5 million people).

# Forensic analysis

The study was approved by the ethics committee of our Hospital, and follows the Helsinki II declaration. Our inclusion criteria were victims of sudden death, from natural cause, younger than 50 years of age. A complete autopsy examination was performed according to current international regulations [1, 18]. When the macroscopic autopsy was labelled as negative, the forensic pathologists performed complete histological and toxicological investigation, and collected a blood sample for genetic investigation. We excluded those cases in which the autopsy was labelled as violent death, including death from drug overdose.

# DNA sample

Genomic DNA was extracted with Chemagic MSM I from post-mortem whole blood (Chemagic human blood). DNA was checked in order to assure quality (Absorbance 260/280:260/230 should be a minimum 1.8: 2.2 respectively), and was quantified before processing with the NGS strategy. Spectrophotometric measurements were performed to assess quality ratios of absorbance; DNA concentration was determined by fluorometry (Qubit, Life Technologies). DNA integrity was assessed on a 0.8% agarose gel.

## NGS sample preparation

The DNA was fragmented (Bioruptor, Diagenode). Library preparation was performed according to the manufacturer's instructions (SureSelect XT Custom 0.5–2.9Mb library, Agilent Technologies, Inc). After capture, indexed libraries were sequenced in six-sample pools per cartridge. Paired-end sequencing process was developed on MiSeq System (Illumina) using 2x150 bp reads length.

# Custom Resequencing panel

Those samples with a good DNA quality were investigated using a custom-made genetic panel, which included 55 genes associated with SCD (*ACTC1*, *ACTN2*, *ANK2*, *CACNA1C*, *CACNB2*, *CASQ2*, *CAV3*, *CRYAB*, *CSRP3*, *DES*, *DMD*, *DSC2*, *DSG2*, *DSP*, *EMD*, *FBN1*, *GLA*, *GPD1L*, *HCN4*, *JPH2*, *JUP*, *KCNE1*, *KCNE2*, *KCNH2*, *KCNJ2*, *KCNQ1*, *LAMP2*, *LDB3*, *LMNA*, *MYBPC3*, *MYH6*, *MYH7*, *MYL2*, *MYL3*, *MYOZ2*, *PDLIM3*, *PKP2*, *PLN*, *PRKAG2*, *RYR2*, *SCN4B*, *SCN5A*, *SGCA*, *SGCB*, *SGCD*, *TAZ*, *TCAP*, *TGFB3*, *TGFBR2*, *TNNC1*, *TNNI3*, *TNNT2*, *TPM1*, *TTN*, and *VCL*). The panel also included structural proteins, as some recent publications have suggested that variants in these genes may be associated with SCD, even in the structurally normal heart [11]. All gene isoforms described in Ensembl 75 (http://www.ensembl.org/) which have been linked at least with either a RefSeq code (http://www.ncbi.nlm.nih.gov/refseq/) or CCDS (https://www.ncbi.nlm.nih.gov/CCDS/) were included. Coordinates



of sequence data were based on UCSC human genome version hg19 (NCBI GRCh37 built). Biotinylated cRNA probe solution was used as a capture probe (Agilent Technologies). Probes were designed using eArray (Agilent Technologies) and the design was optimized by Gendiag. exe S.L. The gene panel final size was 432,512kbp. This custom enrichment gene design is commercialized by Ferrer inCode as SudD inCode®.

# Sanger sequencing

Sanger sequencing was used to confirm non-common (Minor Allele Frequency–MAF- < 1%) genetic variants detected by NGS, as well as in the genetic analysis of those cases with poor DNA quality. In this situation, we limited the analysis to the guideline recommended genes (SCN5A -NM 198056-, KCNQ1 -NM 000218-, KCNH2 -NM 000238-, KCNE1 -NM 000219-, KCNE2 -NM\_172201-, and RyR2 -NM\_001035-) [29, 30]. The exons and exon-intron boundaries of each gene were amplified (Verities PCR, Applied Biosystems, Austin, TX, USA), the PCR products were purified (Exosap-IT, Affymetrix, Inc. USB® Products, Cleveland, OH, USA) and they were directly sequenced in both directions (Big Dye Terminator v3.1 and 3130XL Genetic Analyzer, both from Applied Biosystems) with posterior SeqScape Software v2.5 (Life Technologies) analysis, comparing obtained results with the reference sequence from hg19. The identified variations were compared with DNA sequences from 300 healthy Spanish individuals (individuals not related to any patient and of the same ethnicity; 600 alleles), as control cases, and contrasted with Human Gene Mutation Database -HGMD-(http://www.hgmd.cf.ac.uk/ac/index.php), HapMap (http://hapmap.ncbi.nlm.nih.gov/), 1000 genomes project (http://www.1000genomes.org/), Exome Aggregation Consortium-ExAC-(http://exac.broadinstitute.org/), and Exome Variant Server-EVS-(http://evs.gs.washington. edu/EVS/). Sequence variants were described following the HGVS rules (http://www.hgvs.org/ ), and checked in Mutalyzer (https://mutalyzer.nl/).

## **Bioinformatics**

The secondary bioinformatic analysis of the data obtained included adaptor and low quality bases trimming on FASTQ files. Trimmed reads were mapped with GEM III. The output were sorted and uniquely and properly mapped read pairs were selected. Finally, the variant calling over the cleaned BAM were performed with SAMtools v.1.2 together with an ad hoc developed script. The final annotation steps provided information included in public databases. Variants were annotated with dbSNP human build 142 IDs (http://www.ncbi.nlm.nih.gov/SNP/); the 1000 Genomes browser Phase 3 (http://www.1000genomes.org/); the Exome Aggregation Consortium (ExAC) v.0.3 (http://exac.broadinstitute.org/); NHLBI Exome Sequencing Project (ESP) ESP6500SI-V2 (http://evs.gs.washington.edu/EVS/); Ensembl information and in-home database IDs, if available. The Human Gene Mutation Database (HGMD, http://www.hgmd. cf.ac.uk/ac/index.php) was also consulted to identify previously reported pathogenic mutations. In silico prediction of pathogenicity of novel genetic variations was assessed in CONDEL software (CONsensus DELeteriousness scores of missense SNVs) (http://bg.upf.edu/condel/), Mutation Taster (http://www.mutationtaster.org/), and PROVEAN (Protein Variation Effect Analyzer) (http://provean.jcvi.org/index.php). Alignment of DNA sequences for different species was also performed for these novel variations using UniProt database (http://www. uniprot.org/).

## Assessment of pathogenicity

The rare variants (MAF < 1%) were classified according recent ACMG guidelines [31], following the criteria:



Likely/probably benign variants (PBV):

- Variants already described in any of databases, with all in-silico models predicted neutrality.
   Variants of uncertain/unknown significance (VUS):
- Novel variants and all in-silico models predicted neutrality or differed between predictions.
- Variants already described in any of databases, and in-silico models differed between predictions.

Likely/probably pathogenic variants (PPV):

- Likely pathogenic variants reported to be disease-causing but where the author has indicated
  that there may be some degree of doubt, or subsequent evidence has come to light in the
  literature.
- Radical variants (insertions, deletions or premature stop codons)
- Splice site variants between ± 5 nucleotides, and all in-silico models consulted predicted pathogenicity.
- Novel variants with all in-silico models predicting pathogenicity.
   Disease causing mutations (DM):
- Variants already reported to be disease-causing.

#### Results

This is a three-year prospective study that was started on February 2012. We have collected a total of 789 consecutive cases -609 males (77.19%) and 180 females (22.81%)-. The range of age is from 0 to 50 years of age (average  $38.6\pm12.2$  years old). The average age is  $39.3\pm11.2$  years in males and  $36.2\pm14.9$  years in females. In order to classify the cases, we have divided the cohort in groups of 10 years (0–10, 11–20, 21–30, 31–40, 41–50 years old).

# Prevalence of natural death according to age

In our cohort, most cases were between 41 and 50 years of age (467 out of 789, 59.19%). A total of 190 cases (24.08%) were between 31–40 years old and 132 cases (16.73%) were below age 30. Regarding gender differences, the number of males was higher in all ranges of age, showing most differences after age 30, with males nearing 80% of cases (Fig 1).

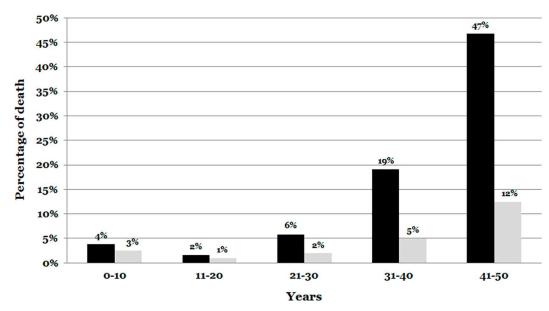
## Context in which the natural death took place

Deaths were classified depending whether they took place during stress/exercise, during sleep, or during routine daily activities. Information about the context of death was provided in 532 cases. The majority of deaths occurred during routine daily activities (376 cases, 70.68%), 98 occurred during sleep (18.42%) and 58 during exercise (10.90%). Deaths during sleep and during exercise were more common before the age of 20 (Fig 2).

## Etiology of death

Concerning the cause of death, the forensic pathologist directly determined a conclusive cause of death after macroscopic evaluation (positive macroscopic autopsy) in 506 cases (64.13%), while a yet inconclusive autopsy (negative macroscopic autopsy) was reported in the





**Fig 1.** Percentage of natural death according to age and gender. The main percentage of death occurs in last range of ages. In all ranges of age, males are a high percentage of death. Males are indicated in black color. Females are indicated in white color.

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remaining cases. Most macroscopically positive cases were males (383 cases, 75.69%). Regarding negative autopsy cases, most of these cases were also males (226 cases, 79.86%).

# Positive macroscopic autopsy

Out of the 506 cases, the macroscopic investigation defined the following causes of death: cardiac in 230 cases (45.45%)—mainly coronary artery disease (127 cases)-; vascular (embolism or hemorrhage) in 137 cases (27.08%); pulmonary/respiratory in 91 cases (17.98%) -infectious process being responsible for the death in 47 cases, and digestive in 21 cases-; finally, 27 cases

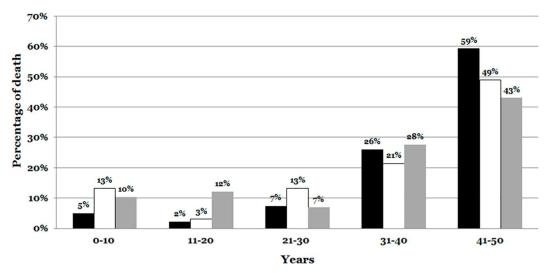


Fig 2. Context of death. The daily activities had a higher prevalence in cases higher 30 years old. Daily activities are indicated in black color. Sleep is indicated in white color. Exercise/Stress is indicated in grey color.



(5.34%), had other less common findings which included 8 non-vascular neurological, 7 carcinogenic, 6 endocrinologic, 2 obstetric, 1 infectious and 3 multiorganic failure.

# Negative macroscopic autopsy. Microscopic analyses

The macroscopic autopsy was not able to detect the cause of death in 283 cases (35.87%) and these were labeled as macroscopically negative. To identify a potential cause of death, these cases were further investigated with histological analysis. This investigation was able to refine the potential cause of death into the following subgroups: 1) Cardiac, which included coronary disease in 98 cases (34.63%) (presence of thrombus, of myocardial infarction or of severe coronary stenosis >75%), and 36 (12.72%) potentially cardiac inherited cases, by histological identification of cardiomyopathy; and, 2) unexplained cases, which included 149 (52.65%) cases with microscopic findings showing no histological alterations). Among these 149 cases, there were 23 cases (15.44%) in which death occurred before the first year of age, thus they were labeled as sudden infant death syndrome (SIDS).

# Natural death according to context and final autopsy results

With further inclusion of histological analysis, 364 out of 789 cases (46%) were definitively labeled as deaths from a cardiac origin. This percentage is underrepresented, as it did not include the 149 negative cases, some of whom presumably died also from cardiac causes. Stress/exercise related death was more frequent in cardiac cases (51.72%), while deaths during daily activity were more prevalent in vascular (20.23%), as well as pulmonary (12.84%) etiologies (Fig 3).

# Natural Death according to age groups

We have divided the results in five groups of age (Fig 4):

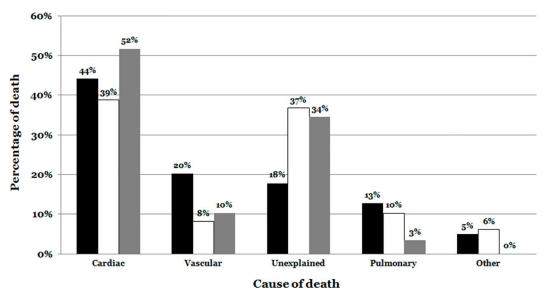
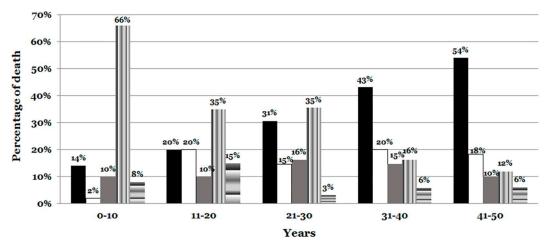


Fig 3. Cause of death according to context of death. The distribution showed that cardiac causes were more prevalent in the context of stress/exercise, while vascular were more prevalent during daily activities. The unexplained cases had a higher presence in context of sleep and stress/exercise. Daily activities are indicated in black color. Sleep is indicated in white color. Exercise/Stress is indicated in grey color.





**Fig 4.** Cause of death distributed according to age. There is an increase of cardiac causes with age, reaching 54% of cases in the older group of age. However the unexplained cases were common in young below 30 years old, reaching the 66% of cases in youngest group of age. Cardiac is indicated in black color. Vascular is indicated in white color. Pulmonary is indicated in grey color. Unexplained is indicated in vertical lines of grey color. Other causes are indicated in horizontal lines of grey color.

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**0–10 years old cohort.** This sub-group included a total of 50 cases (6.34%). Of them, 7 cases (14%) died of cardiac causes (2 DCM, 2 myocarditis, 1 LQTS, 2 cardiac cause not specified), 1 case (2%) of neurological vascular causes, 5 cases (10%) of respiratory affectations (2 infectious, 1 aspiration, 1 asthmatic and 1 obstructive), 3 cases (6%) of cerebral/neurological (2 infectious and 1 malformation), and 1 case (2%) died still birth. Finally, 33 cases (66%) were left unexplained (23 SIDS and 1 SUDEP) after complete autopsy.

**11–20 years old cohort.** This sub-group included 20 cases (2.53%). Of them, 4 (20%) died of cardiac causes (1 HCM, 1 DCM, 1 Congenital and 1 myocarditis), 4 (20%) of vascular causes (3 pulmonary and 1 digestive injuries), 2 (10%) of respiratory affectations (infectious), 1 (5%) of cerebral/neurological edema, and 2 (10%) of other causes (1 digestive and 1 endocrinology). Finally, 7 (35%) cases remained unexplained.

**21–30 years old cohort.** This sub-group included 62 samples (7.86%). A total of 19 (30.65%) died of cardiac causes (6 coronary, 5 HCM, 1 DCM, 2 AC, 1 myocarditis, 1 congenital, 1 transplant, 1 valvular and 1 cardiac cause not specified), 9 (14.52%) of vascular injuries (5 pulmonary, 1 aortic, 2 neurological and 1 digestive injuries), 10 (16.13%) of respiratory affectations (4 infection, 3 edema, 2 aspiration and 1 asthmatic), 1 (1.61%) of cerebral/neurological pathologies (infection), and 1 (1.61%) of other causes (carcinogenic). Finally, 22 (35.48%) cases were unexplained.

**31–40 years old cohort.** This included 190 samples (24.08%). Of them, 82 (43.16%) died of cardiac causes (49 coronary, 11 cardiac causes not specified, 6 DCM, 8 HCM, 1 AC, 3 myocarditis, 2 congenital and 2 fibrosis), 38 (20%) of vascular injuries (15 pulmonary, 9 neurological, 8 aortic and 6 digestive), 28 (14.74%) of respiratory affectations (12 infectious, 7 edema, 3 aspiration, 2 asthmatic and 4 obstructive), 3 (1.58%) of cerebral/neurological pathologies (2 infectious and 1 edema), and 8 (4.21%) of other causes (3 digestive, 4 carcinogenic and 1 multiorganic failure). Finally, 31 (16.32%) cases were unexplained.

**41–50 years old cohort.** This included 467 samples (59.19%). Of them, 252 (53.96%) died of cardiac causes (171 coronary, 24 cardiac causes not specified, 18 DCM, 34 HCM, 2 AC, 2 Valvular, 1 pericarditis), 85 (18.20%) of vascular injuries (31 pulmonary, 28 digestive, 19 neurological, and 7 aortic), 46 (9.85%) of respiratory affectations (27 infectious, 10 edema, 6



obstructive, 1 asthmatic, 1 aspiration, and 1 hemorrhagic), and 28 (5.99%) of other causes (17 digestive, 7 carcinogenic, 1 endocrine, 1 multiorganic failure, 1 obstetric and 1 renal infectious causes). Finally, 56 (11.99%) cases were unexplained.

# Molecular autopsy

In addition to defining the etiology of natural death in our cohort, we wanted to assess whether the use of genetics could improve diagnosis ascertainment, and could better define which, if any, family members should undergo clinical/genetic evaluation. Thus, we focused our efforts in those forensic cases with potentially inherited disease or with negative microscopic autopsy:

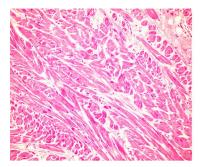
# Potentially inherited subgroup

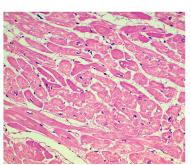
This study was limited to cases previously considered macroscopically negative by the forensic pathologist but identified after histological analysis. A total of 32 samples showing histological alterations associated with cardiomyopathies (10 DCM, 19 HCM, 1 AC, and 2 fibrosis)(Fig 5) were screened by NGS method. The genetic screening identified a total of 62 rare variants in 25 out of 32 samples (78.13%). Twelve variants (19.35%) were novel. All cases carried at least one variant in genes codifying for structural proteins. However, 10 cases carried at least one additional rare variant in genes encoding proteins associated with ion channels or associated proteins. According to our classification criteria, 2 variants (3.23%) were considered PBV, 39 (62.90%) VUS, 12 (19.35%) PPV, and 9 (14.52%) DM (Table 1).

# Unexplained sudden death subgroup

The analysis was performed in 119 samples with negative results after macroscopic and histological studies.

All samples were analyzed using NGS technology except in 24 samples in which the screening was limited to Sanger sequencing due to low DNA quality. The Sanger sequencing method identified at least one rare variant in 6 out of 24 (25%) samples. On the other hand, with the use of NGS technology we identified 76 out of 95 (80%) samples carrying at least one rare variant. Concerning NGS samples, 41 of them (43.2%) carried at least one rare variant in genes encoding proteins associated with ion channels, and 64 (67.3%) carried at least one rare variant in genes codifying for structural proteins. Overall, we detected 49(41.2%) samples carrying PPV and/or DM. The genetic screening identified a total of 197 rare variants, 6 detected by Sanger method and 191 by NGS method. Thirty-six (18.27%) were novel variants. Our criteria classified 16 (8.12%) as PBV, 100 (50.76%) as VUS, 60 (30.46%) as PPV and 21 (10.66%) as DM (Table 2).





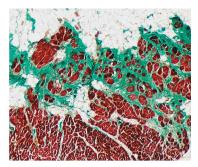


Fig 5. Representative microscopic images of samples showing cardiomyopathy. Left. Hypertrophic Cardiomyopathy (Hematoxylin-Eosin, 20x); Center. Dilated Cardiomyopathy (Hematoxylin-Eosin, 20x); Right. Arrhythmogenic Cardiomyopathy (Masson's Trichrome, 10x).



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PPH2	Damaging	Damaging	Damaging	Benign	Damaging	Damaging	Damaging	Damaging	Damaging	Damaging	Damaging	Benign	Benign	Damaging	I	Damaging	Benign	Damaging	Damaging	I	Damaging	1	Damaging	Damaging	Damaging	I	Damaging
Disease	HCM	ARVC	I	I	I	LQTS	HCM	I	I	1	ARVC	I	Marfan	I	ı	I	ARVC	I	ı	I	BrS	I	I	I	I	I	ı
Classification	DM	PPV	NUS	PBV	NUS	MO	MO	NUS	NUS	NUS	DM	NUS	PPV	PPV	NUS	NUS	MQ	NUS	PPV	PPV	PPV	NUS	PPV	NUS	NUS	PPV	SUV
HGMD	CM050764	CM098198	I	I	ı	CM077628	CM981325	ı	1	I	CM061171	1	CM010035	1	ı	1	CM116750	I	1	l	CM054856	I	1	1	1	1	ı
ExAC %	I	0.01139	0.006589	0.003331	I	0.01131	ı	0.04558	0.1708	0.1372	0.01679	ı	0.04632	I	I	0.4045	0.4143	0.4396	I	I	I	0.0008242	I	0.001666	0.004943	I	ı
MAF	I	I	I	I	1	I	1	0.0722/0/	0.1332/ 0.6309/ 0.2741	0.1332/ 0.359/ 0.2057	0.0358/0.0/ 0.0238	1	0.0349/0.0/	1	I	0.4066/ 0.0495/ 0.2902	0.4067/ 0.0745/ 0.2987	0.4419/ 0.0908/ 0.3229	I	I	0.0119/0/	I	I	I	0.0/0.0227/	1	ı
dpSNP	I	rs570878629	rs565398652	rs750026544	ı	rs199473069	rs397515907	rs72648947	rs72648964	rs72646823	rs199601548	ı	rs111801777	ı	rs746620876	rs72648272	rs72650011	rs72647894	1	rs281864930	rs199473101	I	I	I	rs150021739	I	ı
Variant	p.R204H	p.T19I	p.L682F	p.127090T	p.18681V	p.R190Q	p.R502Q	p.A4940T	p.G5814D	p.K15950R	p.Q62K	p.Q533R	p.T1020A	p.R28370T	p.T3776A	p.R30180C	p.H8848Y	p.R3120Q	p.E3062G	p.K3395fs	p.R376H	p.A34V	р.Р29932Н	p.R15537H	p.R662W	p. Y847_N850delinD	p.V11458L
Nucleotide	c.611G>A	c.56C>T	c.2046A>T	c.81269T>C	c.26041A>G	c.569G>A	c.1505G>A	c.14818G>A	c.17441G>A	c.47849A>G	c.184C>A	c.1598A>G	c.3058A>G	c.85109G>C	c.11326A>G	c.90538C>T	c.26542C>T	c.9359G>A	c.9185A>G	c.100184delA	c.1127G>A	c.101C>T	c.89795C>A	c.46610G>A	c.1984C>T	c.2539_2549delinG	c.34372G>C
Gene	TNNI3	JUP	NCF	NTT	NTT	SCN5A	МҮВРСЗ	NTT	ZE .	NTT	PKP2	МҮВРСЗ	FBN1	NET	ANK2	NET.	ST.	NE F	ANK2	NET.	SCN5A	TNNT2	NTT	NIT	ACTN2	MYBPC3	NTT
Autopsy	HCM	DCM				HCM	HCM	HCM			HCM				Fibrosis				Fibrosis		HOM				DCM	HOM	
Gender	Σ	Σ				Σ	Σ	Σ			Σ				Σ				Σ		Σ				Σ	Σ	
Age	17	19				26	56	59			30				31				31		37				38	88	
Proc.	NGS	NGS				NGS	NGS	NGS			NGS				NGS				NGS		NGS				NGS	NGS	
_	-	7	N	7	2	ო	4	D.	2	r.	9	9	9	9	7	7		^	8	80	თ	6	o	6	9	Ξ	=
Range	11–20	11–20	11–20	11–20	11–20	21–30	21–30	21–30	21–30	21–30	21–30	21–30	21–30	21–30	31-40	31–40	31–40	31–40	31–40	31–40	31–40	31–40	31–40	31–40	31–40	31–40	31–40



₽	Proc.	-	Gender	Autopsy	Gene	Nucleotide	Variant	dpSNP	MAF	ExAC %	HGMD	Classification	Disease	PPH2	Provean	Mut. Taster
12	NGS	33	Σ	HCM	DSG2	c.3175T>A	p.S1059T	rs201786158	I	0.02816	CM071712	DM	ARVC	Damaging	Neutral	Polymorphism
12					MYBPC3	c.103C>T	p.R35W	ı	I	0.005626	CM0910203	DM	HCM	Damaging	Deleterious	Disease causing
12					NTT	c.15625G>A	p.G5209S	rs374964612	0.0121/0.0/	0.005090	I	VUS	I	Damaging	Deleterious	Disease causing
13	NGS	40	Σ	HCM	NTL	c.76559G>A	p.S25520N	rs200450022	0.085/0.0/	0.05921	I	SUV	I	Bening	Neutral	Disease
13					VILL	c.17066G>C	p.G5689A	rs200118743	0.0843/0.0/	0.08920	I	NUS	I	Bening	Neutral	Disease
4	NGS	14	Σ	DCM	MYBPC3	c.2177C>T	p.R726C	1	I	0.003633	CM092563	MO	HCM	Damaging	Deleterious	Disease
4					HCN4	c.2800C>T	p.R934C	rs199638465	0.0133/0/	0.06047	I	SUV	I	Damaging	Neutral	Disease
15	NGS	14	Σ	DCM	DSP	c.6497G>A	p.R2166Q	ı	I	0.0008244	I	NUS	ı	Benign	Neutral	Polymorphism
15					VILL	c.47501T>G	p.115834S	rs776899398	I	0.0008312	I	NUS	ı	Damaging	Deleterious	Disease causing
15					VILL	c.4208G>C	p.R1403T	rs531590921	I	0.03321	I	NUS	ı	Damaging	Deleterious	Disease
16	NGS	44	Σ	HCM	CSRP3	c.10T>C	p.W4R	rs45550635	0.5358/ 0.0455/ 0.3697	0.237	CM023060	WO	DCM	Damaging	Deleterious	Disease
16					HCN4	c.2730C>A	p.F910L	rs200814534	0.0123/0.0/	0.01675	1	NUS	ı	Benign	Neutral	Disease causing
17	NGS	45	Σ	HCM	ANK2	c.10948G>C	p.E3650Q	I	I	0.001649	1	NUS	ı	Benign	Neutral	Disease causing
17					NT.	c.19570G>A	p.D6524N	rs72648973	0.1463/ 0.0539/ 0.1175	0.07463	1	NUS	ı	Damaging	Deleterious	Disease causing
17					NT.	c.41023C>T	p.P13675S	rs72677242	0.3262/ 0.0258/ 0.2305	0.5239	I	NUS	ı	Benign	Deleterious	Disease causing
17					NTT	c.10966G>A	p.A3656T	rs72648923	0.3282/ 0.0267/ 0.2339	0.3419	I	SUV	I	Damaging	Neutral	Disease
8	NGS	45	I	HCM	VILL	c.62584G>A	p.V20862I	rs549709481	I	0.002488	I	NUS	I	Damaging	Neutral	Disease
18					NT.	c.289G>A	p.V97M	rs185921345	0.0349/ 0.0227/ 0.0308	0.2084	1	SUV	I	Damaging	Neutral	Disease
19	NGS	46	Σ	DCM	NT.	c.23131A>G	p.17711V	rs72648994	0.0486/ 0.0524/ 0.0498	0.43	I	SUV	I	Damaging	Neutral	Polymorphism
19					NT.	c.67191A>C	р.Q22397Н	rs201512527	0.1936/ 0.0262/ 0.1406	0.09869	I	NUS	I	Damaging	Neutral	Polymorphism
19					NT.	c.95443G>C	p.E31815Q	rs148525155	0.0603/ 0.512/ 0.0574	0.3337	I	NUS	I	Benign	Deleterious	Disease
20	NGS	46	Σ	HCM	VILL	c.96220- 96222deICCT	p.P32074del	I	I	I	I	PPV	I	I	Deleterious	Disease causing
21	NGS	46	Σ	HCM	BYR2	c.649A>G	p.1217V	rs200642525	0.0362/0.0/	0.01408	CM125874	PPV	LQTS	Benign	Neutral	Disease causing
21					VILL	c.61160G>C	p.G20387A	rs201381085	0.0366/0.0/	0.02398	1	NUS	ı	Damaging	Deleterious	Disease causing
22	NGS	47	ш	DCM	ANK2	c.2048A>G	p.D683G	1	I	ı	I	NUS	ı	Benign	Neutral	Polymorphism
20					CAVA	5/408660	01010	000101000	70 07000			9				ć



Table 1. (Continued)

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Mut. Taster	Disease causing	Disease causing	Polymorphism	Polymorphism	Disease causing	Polymorphism	Disease causing	Polymorphism	Disease causing
Provean	Neutral	Deleterious	Deleterious	Neutral	Neutral	Neutral	Deleterious	Deleterious	Deleterious
PPH2	Benign	Damaging	I	Damaging	Damaging	Benign	Damaging	Damaging	Damaging
Disease	I	I	I	I	I	ı	1	I	I
Classification Disease	NUS	SUV	PPV	SUV	NUS	PBV	PPV	NUS	SUV
HGMD	I	I	I	I	I	I	I	Ι	I
ExAC %	0.001181	0.1492	ı	0.06146	0.0008264	0.003790	I	0.0008860	0.003876
MAF	I	0.1279/ 0.0227/ 0.0923	I	0.0233/ 0.159/ 0.0693	I	I	I	I	0.0119/ 0.0246/ 0.016
dpSNP	I	rs71579374	I	rs149930872	I	ı	I	ı	rs111616037
Variant	p.K2852R	p.H636R	p.E10254del	p.R490W	p.G269R	p.N550S	p.G18621V	p.G53A	p.G29913R
Nucleotide	c.8555A>G	c.1907A>G	c.30760- 30762delGAA	c.1468C>T	c.712G>T	c.805G>A	c.55862G>T	c.158G>C	c.89737G>A
Gene	DMD	70/	NTT	PKP2	PKP2	CACNA1C	NTT	ANK2	NT.
Autopsy			HCM	HCM	HCM			DCM	
Proc. Age Gender Autopsy			Σ	Σ	ш			Σ	
Age			48	49	49			49	
Proc.			NGS	NGS	NGS			NGS	
₽	22	22	23	24	52	25	52	56	26
Range	41–50	41–50	41–50	41–50	41–50	41–50	41–50	41–50	41–50

(African-American)/ALL; and Minor Alelle Frequency from The Exome Aggregation Consortium (ExAC), both are expressed in percentage. Each variant is classified as Disease NGS, Next Generation sequencing. Age is expressed in years, months (m) or days (d). Autopsy is expressed as Hypertrophy Cardiomyopathy (HCM), Dilated Cardiomyopathy (DCM) and Fibrosis. Variant nomenclature is at cDNA and Protein level. Minor Allele Frequency (MAF) is expressed as EA/AA/ALL respectively, EA (European-American)/AA Mutation (DM), Probably Pathogenic Variant (PPV), Variant of Uncertain Significance (VUS) and Probably Benign Variant (PBV).

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Table 2. Genetic data of variants identified, 81 positive cases from the 119 SUD cases.

Polymorphism Polymorphism Polymorphism Polymorphism Polymorphism Polymorphism Polymorphism Disease causing Disease causing Mut. Taste Disease causing Disease causing Disease causing Disease causing Disease Deleterious Deleterious Deleterious Deleterious Provean Neutral Damaging Benign PPH2 Benign Benign Benign Benign Benign Benign Disease Marfan ARVC SCD SCD SCD  $I \mid I$ 1 1 Classification VUS VUS PPV PΡV PΡV PBV PPV PBV /US VUS PBV PPV PPV PBV PBV P BM1492175 CM1413436 CM1413453 CM950453 HGMD | | |1 1 ExAC % 0.0008238 0.7488 0.04143 0.05575 0.04174 0.2733 0.07331 0.00161 0.023 0.449 0.0595/0.0/ 0.0297/0.0/ 0.0189 0.012/0.0/ 0.061/0.0/ MAF (%) 0.0239/ 0.1711/ 0.0722 0.0244/ 0.3203/ 0.1171 0.0243/ 0.1318/ 0.0582 0.0243/ 0.1326/ 0.0583 0.0245/ 0.1609/ 0.0672 0.0596/ 0.457/ 0.191 0.1437/ 0.1257/ 0.1379 0.0362/ 0.155/ 0.074 0.1047/ 0.1137/ 0.1078 0.1279/ 0.0227/ 0.0923 0.0608/ 0.0528/ 0.0583 1 rs563320328 rs185788586 rs374408615 rs112122950 rs149763294 rs138853909 rs12720452 rs61746008 rs72648929 rs55850344 rs41315493 rs18792502 rs72468638 rs1915649; dpSNP rs1117279 rs186681 1 p.15584M p.R1937C p.E21559K p.G95R p.R2726W p. R24732H p. W23370S р. R27006H p.P9342Q p.S6016Y p.R5979H p.E1685D p.V1685V p.V3816I p.G615E p.M5867T p.R102S p.E174K c.5598G>C c.11446G>A c.16752C>G c.70109G>C c.18047C>A c.17600T>C c.1107-5C>T c.1003A>G c.1844G>A c.81017G>A c.283G>C c.5809C>T c.8176C>T c.5055G>T c.5054A>T c.5848G>T TTN CACNA1C PRKAG2 SCN5A Gene DSP JUP FBN1 F Ę Š Ę Š Ę N DMD F F Autopsy SIDS SIDS SIDS SIDS SIDS  $\supset$ Gender Σ ΣΣ Σ Σ Σ Age 13d 14m Ę 39 크 Sm Sm æ NGS NGS NGS NGS NGS NGS NGS NGS NGS S 9 Ξ 9 ω 6 0-10 0-10 0-10 0-10 0-10 0-10 0-10 0-10 0-10 0-10 0-10 0-10 0-10 0-10 0-10



Table 2. (Continued)



Polymorphism Polymorphism Polymorphism Mut. Taster Disease causing causing Disease Disease causing Disease causing Disease causing Disease causing causing Disease Disease causing Disease Disease causing causing Deleterious Neutral Provean Neutral Neutral Neutral Neutral Neutral Neutral Neutral Damaging Damaging Damaging Damaging Damaging Damaging Damaging Damaging Benign PPH2 Benign Benign Disease ARVC ARVC LQTS OTS -QTS - $I \mid I$ Classification VUS VUS VUS VUS PΡV ΡPV PΡV PPV PPV VUS VUS /US /US PPV РР PPV M PPV Ճ CM990760 CM109865 CM002332 HGMD CM10286 - $\perp$ ExAC % 0.004143 0.002477 0.0008331 0.0008986 0.01244 0.002485 0.04170 0.002486 0.0008286 0.1756 0.7614 0.006811 0.01297 0.1093 0.2249 0.2484 0.4722 0.0122/0.0/ 0.0116/0.0/ 0.0118/0.0/ 0.0243/0.0/ 0.0116/0.0/ 0.4884/0.0/ MAF (%) 0.0121/0/ 0.0083 0.0245/ 0.0275/ 0.0254 0.1163/0/ 0./00227/ 0.0077 0.2887/ 0.517/ 0.2136 0.0242/0/ 0.2305/ 0.0524/ 0.1742 1 rs368678204 rs201564919 rs147240502 rs368336007 rs369639550 rs368327166 rs12720449 rs199473522 rs770140872 rs376039623 rs72648227 rs72648247 rs37159297 rs7267723 dbSNP rs1441355 1 1 -p. Y9766stop p.P28158S p. E9928dup p.P448R p. W29286S p. W24948R p. R13163C p.P1028A p.R233H p.D113N p. N28623K p.124772K p.R1998H p.T24789F p.P26570T p.H464Q Variant p.A151T p.R176W p.G604S p.E683K p.L586P p.G638R p.1531S p. E32991 c.29781\_29783dupAGA c.74366C>G c.87857G>C 5.2776-4C>A c.1912G>A c.3082C>G c.85866T>A c.74315T>A c.74842T>A c.1810G>A c.2047G>A c.29295T>A c.1757T>C c.79708C>A c.8884G>A c.84472C>T c.1592T>G Nucleotide c.1343C>G c.393-5C>A c.39487C>T c.451G>A c.526C>T c.698G>A c.337G>A c.9897 TTN KCNH2 KCNQ1 RYR2 TNNC1 HCN4 Gene TPM1 N NT PKP2 N N F Ē FBN1 F N N N 2 JUP 2 Autopsy  $\supset$  $\supset$  $\supset$  $\supset$  $\supset$  $\supset$  $\supset$ Gender Ω Σ Σ Σ Σ Age 23 23 23 24 24 24 24 24 Proc. NGS NGS NGS NGS NGS NGS NGS ₽ 23 23 24 24 24 25 25 25 26 26 27 27 28 28 28 29 29 30 8 30 30 3 3 3 Range 21–30 21–30 21-30 21–30 21–30 21–30 21–30 21–30 21–30 21–30 21–30 21–30 21–30  $\begin{array}{c} 21 - \\ 30 \end{array}$ 

Table 2. (Continued)



	Gender	Autopsy	Gene	Nucleotide	Variant	dpSNP	MAF (%)	ExAC %	HGMD	Classification	Disease	PPH2	Provean	Mut. Taster
			N <sub>L</sub>	c.79896G>C	p.M26633I	I		0.02733	I	SUV	I	Damaging	Neutral	Disease causing
			NTT	c.43823G>C	p. G14608A	-	Ι	0.02735	I	NUS	I	Damaging	Deleterious	Disease causing
	Σ	ם	SCN4B	c.613T>C	p.S205P	I	I	I	I	PPV	I	Damaging	Deleterious	Disease
	Σ	n	HCN4	c.2938G>A	p.G980R	1	I	0.003473	I	NUS	I	Damaging	Neutral	Polymorphism
			ANK2	c.2938G>A	p.A2948Q	rs138438183	0.0349/ 0.0227/ 0.0308	0.01898	I	SUV	I	Benign	Neutral	Polymorphism
			NTT	c.68678T>C	p.122893T	I	I	0.0008334	I	SUV	I	Damaging	Neutral	Disease
30	Σ	ם	7 <i>O</i> A	c.829C>A	p.L277M	rs71579353	0.0116/0.0/	0.004126	CM062022	MQ	HCM	Benign	Neutral	Disease
			NTT	c.31720C>T	p.P10574S	rs200992277	I	ı	I	NUS	I	Benign	Deleterious	Polymorphism
98	Σ	D	ANK2	c.4912A>G	p.N1638D	I	I	ı	I	NUS	I	Benign	Neutral	Polymorphism
			NLL	c.88582G>A	p.A29528T	rs376039623	0.0243/0.0/	0.006650	I	SUV	I	Benign	Neutral	Disease
30	Σ	ם	CASQ2	c.730C>T	p.H244Y	rs142036299	I	0.02327	I	SUV	I	Damaging	Deleterious	Disease
33	ш	ם	DES	c.935A>C	p.D312A	rs148947510	0.0/0.2951/	0.03891	CM137784	PPV	CP	Damaging	Deleterious	Disease
33	Σ	ם	MYH7	c.4879A>T	p.11627F	I	I	I	I	SUV	I	Benign	Neutral	Disease
			NLL	c.89786T>C	p.129929T	rs55660660	0.0119/ 0.5682/ 0.1932	0.09549	1	SUV	I	Damaging	Deleterious	Disease causing
			NLL	c.81004A>G	p.127002V	rs139506970	0.0119/ 0.636/ 0.2166	0.07539	I	SUV	I	Benign	Neutral	Disease causing
			NLL	c.76036A>G	p. G19020R	rs18171727	0.024/ 0.6021/ 0.211	0.08071	1	SUV	I	Damaging	Deleterious	Polymorphism
			NLL	c.57058G>A	р.R922Н	rs56046320	0.0116/ 0.9305/ 0.3229	0.09066	1	SUV	I	Benign	Neutral	Disease causing
			NLL	c.2765G>A	p.T25346A	rs188370772	0.0121/ 0.6282/ 0.2053	0.07464	1	SUV	I	Benign	Deleterious	Polymorphism
33	ш	ם	PKP2	c.1872G>T	p.E624D	rs370219248	0.0/0.0227/	0.006593	I	SUV	I	Benign	Neutral	Polymorphism
			ANK2	c.8768A>G	p.Q2923R	rs551454026	I	0.09067	1	NUS	1	Benign	Neutral	Polymorphism
			NLL	c.30515_17delAAG	p. E10172fs	rs397517549	I	I	I	РРУ	I	I	I	Disease causing
34	Σ	D D	BYR2	c.8145G>T	p.E2715D	rs200420897	0.0126/ 0.0283/ 0.0175	I	I	SUV	I	Damaging	Deleterious	Disease causing
			NLL	c.93961G>A	p.V33889I	rs34924609	0.6481/ 0.1623/ 0.4969	0.3311	I	SUV	I	Benign	Neutral	Disease causing
34	Σ	ב	NTT	c.47109T>G	p.F15703L	rs370583314	0.0124/0.0/	0.004479	I	SNA	I	Benign	Deleterious	Polymorphism
			NTT	c.52341A>C	p. E17447D	rs575796706	I	0.001662	I	SUV	I	Benign	Neutral	Disease
			NTT	c.45509A>T	ď	ı	I	0.004973	I	NUS	ı	Damaging	Deleterious	Disease



lable 2. (Confinded)	ة (د با (د										1		:	i	9		
Hange	_		Age	Gender	Autopsy	eue :	Nucleotide	Variant	ANSOD	MAF (%)	EXAC %	O DE	Classification	Disease	ZHAZ	Provean	Mut. I aster
31–40	41					90	c.171/G>1	p.D5/3Y	I	I	I	I	> 1	I	Damaging	Deleterious	Disease causing
31–40	42	NGS	34	ш	ח	DSP	c.4372C>G	p.R1458G	rs28763965	0.2093/ 0.0908/ 0.1692	0.1737	CM113816	РРV	ARVC	Damaging	Neutral	Polymorphism
31–40	42					CACNB2	c.1180G>A	p.V394I	rs149793143	0.0/0.0227/	0.001649	CM127056	DM	BrS	Damaging	Neutral	Disease causing
31–40	42					SCN5A	c.6007T>C	p.F2004L	rs41311117	0.3107/ 0.0497/ 0.2259	0.2018	CM086913	APV.	BrS	Damaging	Neutral	Polymorphism
31–40	43	NGS	35	I	ם	MYBPC3	c.3569G>T	p.R1190L	rs117354682	0.0/0.0254/	0.005870	I	NUS	I	Damaging	Deleterious	Disease causing
31–40	43					МҮВРСЗ	c.961G>A	p.V321M	rs200119454	0.0471/ 0.0232/ 0.039	0.04625	CM115891	MO	DCM	Damaging	Neutral	Disease
31–40	44	σ	36	Σ	ם	SCN5A	c.3530C>G	p.P1177R	I	ı	ı	ı	PPV	ı	Damaging	Deleterious	Disease causing
31–40	45	NGS	36	ш	כ	KCNJZ	c.1229A>G	p.N410S	rs141069645	0.0233/ 0.0454/ 0.0308	0.03722	CM1313311	MO	LQTS	Benign	Neutral	Disease
31–40	46	NGS	36	ш	ס	PKP2	c.611G>A	p.R204H	rs755215178	ı	0.007414	I	PBV	ı	Benign	Neutral	Polymorphism
31–40	46					FBN1	c.83A>G	p.N28S	rs193922245	1	0.00659	I	PBV	I	Benign	Neutral	Polymorphism
31–40	47 N	NGS	37	Σ	ח	SCN5A	c.4G>A	p.A2T	rs199473042	I	0.002537	CM104269	DM	BrS	Damaging	Neutral	Disease causing
31–40	47					SCN5A	c.1855C>T	p.L619F	rs199473133	0.0238/0.0/	0.003699	CM030952	DM	LQTS	Damaging	Neutral	Disease causing
31–40	48 N	NGS	37	Σ	ח	JPH2	c.1625G>A	p.R542H	rs369279135	0.0/0.0304/	0.005589	I	PBV	I	Benign	Neutral	Polymorphism
31–40	49 V	NGS	88	Σ	ם	PRKAG2	c.298G>A	p.G100S	rs79474211	0.0814/ 0.0908/ 0.0846	0.8132	CM136115	MO	PRKAG2 syndrome	Damaging	Neutral	Disease causing
31–40	49					ACTN2	c.1975-6C>G	I	rs201255023	ı	0.1120	I	NUS	I	I	ı	I
31–40	64					NTT	c.77702C>G	p. S25901C	rs202040332	0.7558/ 0.227/ 0.5767	0.1666	I	SUV	I	Damaging	Deleterious	Disease
31–40	49					FBN1	c.6987C>G	p.D2329E	rs363831	0.0/0.1137/	0.06105	I	SUV	ı	Neutral	Neutral	Polymorphism
31–40	49					FBN1	5672-3T>C	ı	rs193922217	ı	I	I	PPV	I	ı	ı	ı
31–40	20 N	NGS	38	ш	ח	DSP	c.8402G>A	p.R2801H	I	I	0.0008249	I	PPV	I	Damaging	Deleterious	Disease causing
31–40	20					NTT	c.10503G>C	p.K3501N	ı	ı	I	I	NUS	I	Damaging	Neutral	Polymorphism
31–40	51 N	NGS	38	Σ	ם	SCN5A	c.4648G>C	p.D1550H	I	I	1	Ι	PPV	Ι	Damaging	Deleterious	Disease causing
31–40	21					NTT	c.5419C>A	p.P1807T	rs200563229	I	0.0008254	I	NUS	I	Damaging	Deleterious	Disease causing
31–40	52 N	NGS	88	Σ	)	DSP	c.3399C>G	p.D1133E	I	I	I	I	PPV	I	Damaging	Deleterious	Disease causing
31–40	25					DSC2	c.2603C>T	p.S868F	rs141873745	0.0/0.0227/	0.005769	I	PBV	I	Benign	Neutral	Polymorphism
31–40		NGS	39	Σ	ס	TGFB3	c.97G>A	p.G33S	I	ı	0.003295	I	PBV	I	Benign	Neutral	Polymorphism
31–40	53					NTT	c.19013C>G	p.S6338C	ı	I	0.003320	I	SUV	I	Damaging	Deleterious	Polymorphism
31–40	24 N	NSG	39	Σ	n n	NLL	c.23200G>C	p.D7734H	I	I	0.0008503	I	SUV	I	Damaging	Deleterious	Disease causing
31–40	22	S	40	Σ	)	KCNH2	c.2119T>C	р.Ү707Н	I	I	I	I	PPV	I	Damaging	Deleterious	Disease causing
																	(Continued)

Polymorphism Polymorphism Polymorphism Mut. Taster Disease causing Deleterious Provean Deleterious Deleterious Neutral Neutral Neutral Neutral Neutral Neutral Neutral Neutral Damaging Damaging Damaging Damaging Damaging PPH2 Benign Benign Benign Benign Benign Benign Benign Benign -LQTS-DA Lats ARVC S 1 -Classification VUS VUS DM РРV PΡV ΡPV VUS /US /US VUS PPV PPV PPV PPV PBV PPV PPV Σ Σ CM070176 CM1010258 CM131331 HGMD 1 -0.002477 0.001141 0.004237 ExAC% 0.03722 0.08816 0.06344 0.3804 0.0127 0.04304 0.02074 0.06609 0.267 0.0/0.0274/ 0.0119/0.0/ 0.0241/0.0/ 0.0162 0.1092/0.0/ 0.0745 0.0/0.1365/ MAF (%) 0.0/0.6809/ 0.686/ 0.1135/ 0.4921 0.0116/ 0.0227/ 0.0154 0.0233/ 0.0454/ 0.0308 0.4186/ 0.0908/ 0.3076 0.3747/ 0.0261/ 0.2642 0.0581/ 0.0227/ 0.0461 rs141069645 rs200450676 rs146732972 rs369462016 rs200092869 rs375116558 rs192722540 rs150722502 rs745717858 rs141314684 rs79577190 rs141401803 rs751153777 rs2234916 rs76649554 rs7264898 dbSNP 1 1 1 1 p.R1079W p.R1388H p. M28069T p.E1204D p.E7030K p.N410S p.R4307C p.Y2092C p.D310N p.E1128D p.E3931K Variant p.N1890S p.R70H p.R954C p.R2057W p.Q737R p.A546E p.G3822A p.A223T p.T8A c.50144-4G>A 5.21088G>A c.583+5G>A c.1229A>G c.12919C>T c.11465G>C c.84206T>C Nucleotide c.5669A>G c.6275A>G c.2210A>G c.1637C>A c.11791G>A c.2941A>G c.3612G>C c.1387G>T c.3384G>C c.209G>A c.928G>A c.22A>G c.475G>T CACNA1C **MYBPC3** TTN KCNJ2 KCNH2 KCNE2 **KCNH2** MYH7 RYR2 ANK2 Gene FBN1 DMD HCN4 PKP2 N N F JUP Autopsy  $\supset$  $\supset$ Gender Σ Σ Σ Σ Σ Σ ш Σ Σ Σ Σ Σ Age 4 42 4 45 42 42 43 43 43 4 4 44 43 Proc. NGS S 59 9 ₽ 99 22 57 57 22 58 9 61 62 62 62 62 62 62 63 64 65 99 99 99 67 89 67 31-40 41–50 41-50 41-50 41-50 41-50 41-50 41-50 41-50 41-50 41-50 41-50 41-50 41-50 41-50 41-50 41-50 41-50



Mut. Taster	Polymorphism	Disease causing	Polymorphism	Disease causing	Disease causing	ı	Polymorphism	Polymorphism	Disease	Polymorphism	Disease causing	Disease causing	Disease causing	Disease	Disease	Disease causing	Disease	1	Disease causing	Disease causing	Disease causing	Polymorphism	1	Disease causing	Disease causing	Disease causing	Disease
Provean		Neutral	Neutral	Deleterious	Deleterious	ı	Neutral	Neutral	Deleterious	Neutral	Deleterious	Deleterious	Deleterious	Neutral	Deleterious	Deleterious	Deleterious	I	Neutral	Deleterious	Deleterious	Neutral	ı	Deleterious	Deleterious	Neutral	Neutral
PPH2	Benign	Damaging	Benign	Damaging	Damaging	ı	Damaging	Benign	Damaging	Benign	Damaging	Damaging	Damaging	Benign	Damaging	Damaging	Benign	ı	Benign	Damaging	Damaging	Damaging	ı	Damaging	Damaging	Benign	Damading
Disease	ı	I	I	I	I	ı	ı	I	ı	I	I	I	SCD	I	HCM	I	I	I	I	I	I	ARVC	1	MD	I	DCM	ΔΔT
Classification	PBV	ЬРУ	PBV	NUS	NUS	NUS	SUV	PBV	SUV	NUS	NUS	PPV	VAd	SUV	MQ	NUS	SUV	NUS	NUS	NUS	NUS	PPV	PPV	MO	PPV	MO	N C
HGMD	I	1	I	I	I	ı	ı	I	I	I	I	I	CM1413461	I	CM081343	I	I	I	I	I	I	CM098196	ı	CM980306	I	CM052257	CM063201
ExAC %	0.003299	0.003299	0.01457	0.02622	0.001820	ı	0.0008291	0.01333	0.02059	I	0.004945	0.0008383	0.1961	0.002489	0.0008536	0.1492	I	0.3114	0.7222	0.009807	0.01079	0.05558	ı	0.1125	ı	0.09801	0 1156
MAF (%)	I	I	I	0.0/0.0238/	I	ı	ı	0.0122/ 0.0522/ 0.0249	I	I	I	I	0.315/ 0.0264/ 0.2242	I	I	0.1279/ 0.0227/ 0.0923	I	0.0/0.0227/	0.1047/ 0.1135/ 0.1076	I	0.012/0.0/	0.061/0.0/	1	0.1744/ 0.0681/ 0.1384	I	0.1279/ 0.0227/ 0.0923	0.3023/
dpSNP	ı	1	I	rs199728019	rs779343098	rs534740669	1	rs199776761	rs144261171	ı	1	I	rs72646880	rs564621227	1	rs71579374	ı	rs80344206	rs3740343	ı	rs369899675	rs191564916	ı	rs116840776	I	s143978652	re35766612
Variant	p.A16T	p.L14M	p.T6083M	р.G596R	p.P18487L	ı	p. R13599Q	p.R2010Q	p.R212Q	p.130913V	p.R2317H	p.K480N	p.A20252P	p.V17616I	p.E1205K	p.H636R	p. H22787R	ı	p.V55I	p. N33144H	p. R28674H	p.T335A	ı	p.C72W	p.S2458C	p.A1004S	M282M
Nucleotide	c.46G>A	c.40C>A	c.18248C>T	c.1786G>A	c.55460C>T	c.1140+6T>C	c.40796G>A	c.6029G>A	c.635G>A	c.92737A>G	c.6950G>A	c.1440A>C	c.60754G>C	c.52846G>A	c.3613G>A	c.1907A>G	c.68360A>G	c.3463+3A>G	c.163G>A	c.99430A>C	c.86021G>A	c.1003A>G	c.1140+2T>C	c.216C>G	c.7372A>T	c.3010G>T	0.1150G>A
Gene	KCNE3	KCNE3	NTT	MYBPC3	NTT	DSP	NTL	CACNA1C	DES	NTL	NTL	SCN5A	NTT	NTL	MYH7	70/1	NTL	FBN1	ЕВОТ	NTT	NTT	DSG2	SCN5A	CAV3	ANK2	МҮН6	TGERRO
Autopsy				D .	ם	ס		D D				ם			ם	D .		ם				ם		D			
Gender				Σ	Σ	Σ		Σ				Σ			ш	Σ		Σ				Σ		Σ			
. Age				42	46	46		47				48			84	48		84				48		49			_
Proc.				NGS	NGS	NGS		NGS				NGS			NGS	NGS		NGS				NGS					
_		89		69	02	7		72	72		72	73	73	73	74	75	75	92	92 (	92	92 (	77		78	78	78	78
Range	41–50	41–50	41–50	41–50	41–50	41–50	41–50	41–50	41–50	41-50	41–50	41–50	41–50	41–50	41–50	41–50	41–50	41–50	41–50	41–50	41–50	41–50	41–50	41–50	41–50	41–50	41–50



Table 2. (Continued)

Mut. Taster	Disease causing	Polymorphism	Disease causing	Disease causing	Disease causing	Polymorphism	Disease causing	Polymorphism	Polymorphism	Disease causing	Polymorphism	Disease causing
Provean	Deleterious	Neutral	Neutral	Neutral	Deleterious	Deleterious	Neutral	Neutral	Deleterious	Deleterious	Neutral	Deleterious
PPH2	Benign	Benign	Damaging	Damaging	Damaging	Damaging	Damaging	Benign	Benign	Damaging	Benign	Damaging
Disease	Mandibular dysplasia	LQTS	HCM	I	SCD	ı	I	I	ı	I	I	I
Classification	MQ	PPV	MQ	NUS	PPV	NUS	NUS	NUS	NUS	NUS	PBV	NUS
HGMD	CM021630	CM034060	CM032957	I	CM1413459	ı	ı	ı	ı	l	ı	l
ExAC %	0.006832	0.4304	0.1682	0.01746	0.01195	ı	0.01147	0.03627	ı	0.003123	0.02567	0.01318
MAF (%)	0.0116/0.0/	0.2388/ 0.0245/ 0.1685	0.1758/0.0/	0.0242/ 0.0261/ 0.0248	0.0122/0.0/	ı	I	0.0116/	ı	0.0116/0.0/	0.0123/0.0/	0.0116/0.0/
dpSNP	rs57520892	rs36210423	rs199865688	rs183276016	rs373876117	ı	rs61741930	rs141124755	ı	rs369447207	rs376613199	rs138060032
Variant	p.R527H	p.A572D	p.A833T	p.A19576T	p.P29832T	p.R5796L	p.A1128T	p.S3909P	p.K29291T	p.C57W	p.19305V	p.R279W
Nucleotide	c.1580G>A	c.1715C>A	c.2497G>A	c.58726G>A	c.89494C>A	c.17387G>T	c.3382G>A	c.11725T>C	c.87872A>C	c.171C>G	c.27913A>G	c.835C>T
Gene	LMNA	SCN5A	MYBPC3	NTT	NTT	NTT	MYH7	ANK2	NTT	TCAP	NTT	NTT
Gender Autopsy		D					ח			ם		
Gender		Σ					ш			Σ		
Age		49					20			20		
Proc.		NGS					NGS			NGS		
0	78	62	62	62	62	62	80	80	80	18	8	81
Range	41–50	41–50	41–50	41–50	41–50	41–50	41–50	41–50	41–50	41–50	41–50	41–50

technology. SCD means Sudden Cardiac Death. Minor Allele Frequency (MAF) is expressed as EA/AA/ALL respectively, EA (European-American)/AA (African-American)/ALL; and Pathogenic Variant (PPV), Variant of Uncertain Significance (VUS) and Probably Benign Variant (PBV). TAA means Thoracic Aortic Aneurysm. MD means Muscular Dystrophy. CA NGS, Next Generation sequencing. Age is expressed in years, months (m) or days (d). Gender is expressed as Males (M) and Females (F). Autopsy is expressed as Unexplained (U), Sudden Infant Death Syndrome (SIDS) or Sudden Unexplained Death cases with Epilepsy (SUDEP). Variant nomenclature is at cDNA and Protein level. S means Sanger Minor Alelle Frequency from The Exome Aggregation Consortium (ExAC), both are expressed in percentage. Each variant is classified as Disease Mutation (DM), Probably means Cardiac Arrhythmia. CP means Cardiomyopathy. LQTS-DA means Long QT Syndrome Drug-Associated.



Concerning ranges of age, the youngest cohort (between 0–10 years of age) included 28 samples (14 males -50%-, and 14 females -50%-). A total of 11 samples were screened by Sanger method, and 17 by NGS. The genetic screening by both technologies identified a total of 37 rare variants, 3 detected by Sanger method and 34 by NGS method. Four variants (10.81%) were novel. We detected 16 samples carrying at least one rare genetic variant (57.14%). Six samples (21.43%) carried variants in genes associated with ion channels and 12 samples (42.86%) carried variants in genes codifying for structural proteins. We identified 10 (35.71%) samples carrying PPV and/or DM. Finally, pathogenicity criteria classified 6 variants (16.22%) as PBV, 14 (37.84%) as VUS, 16 (43.24%) as PPV and 1 (2.7%) as DM.

The cohort between 11–21 years of age included 7 samples (5 males -71.43%-, and 2 females -28.57%-). A total of 2 samples were screened by Sanger method, 5 by NGS. The genetic screening identified a total of 10 rare variants by NGS method. The Sanger screening did not identify positive samples carrying rare variants. Of identified variants, 2 (20%) were novel. NGS method identified 4 samples (80%) carrying at least one rare variant, 3 (42.86%) carried variants in genes associated with ion channels, and 4 (57.14%) in genes codifying for structural proteins. Our classification criteria for all samples screened identified 2 (28.57%) samples carrying PPV and/or DM. Finally our classification criteria divided the 10 variants in 4 (40%) VUS, 4 (40%) PPV and 2 (20%) DM.

The cohort between 21–30 years of age included 19 samples (14 males -73.68%-, and 5 females -26.32%-). All were screened by NGS. The genetic screening identified a total of 42 rare variants. Of all them, 10 (23.81%) were novel. At least one rare variant was detected in 16 samples (84.21%), 12 (63.16%) in genes associated with ion channels, and 15 (78.95%) in genes codifying for structural proteins. Our criteria classified 9 (47.37%) as PPV and/or DM. Finally our classification criteria divided the 42 variants in 29 (69.05%) VUS, 10 (23.81%) PPV, and 3 (7.14%) DM.

The cohort between 31–40 years of age included 29 samples (20 males -68.97%-, and 9 females -31.03%-). A total of 3 samples were screened by Sanger method, 26 by NGS. Sanger screening identified 2 (66.67%) positive samples for rare variants. The genetic screening by both methods identified a total of 44 rare variants, 2 (4.5%) detected by Sanger method and 42 (95.5%) by NGS method. Of all them, 7 (15.91%) were novel. NGS method identified 18 samples (69.23%) carrying at least one rare variant, 6 (33.3%) carried variants in genes associated with ion channels, and 16 (55.2%) in genes codifying for structural proteins. Our classification criteria for all samples screened identified 13 (44.83%) samples carrying PPV and/or DM. Finally our criteria classified the 44 variants in 5 (11.36%) PBV, 22 (50%) VUS, 11 (25%) PPV and 6 (13.64%) DM.

The oldest cohort (between 41–50 years old), included 36 samples (28 males -77.78%-, and 8 females -22.22%-). A total of 8 samples were screened by Sanger method, 28 by NGS. The genetic screening by both methods identified a total of 64 rare variants, 1 (1.6%) detected by Sanger method and 63 (98.44%) by NGS method. Of all them, 13 (20.31%) were novel. NGS method identified 24 samples (85.7%) carrying at least one rare variant, 14 (50%) in genes associated with ion channels, and 20 (71.4%) in genes codifying for structural proteins. Our criteria classified 14 (38.89%) variants as PPV and/or DM. Finally our criteria classified the 64 variants in 5 (7.81%) PBV, 33 (51.56%) VUS, 17 (26.56%) PPV, and 9 (14.06%) DM.

## **Discussion**

In this prospective cohort we have methodically examined the etiology of natural death by performing a comprehensive investigation that includes a thorough autopsy examination and the inclusion of an extensive molecular autopsy. We have analyzed a total of 789 SD cases younger than 50 years of age. By concentrating all our cases in a same institution, a same autopsy protocol was followed, according to international forensic recommendations[1, 18].



Regarding epidemiological data, our data are in concordance with previous studies [32]. Thus we observed similar results in victims' mean age (39.3 years old), gender (77.19% males), progressive increase in SD prevalence from age 0 to 50, and predominance of male deaths in all ranges of age.

The primary cause of SD was cardiac -81.1%-, similar to other cohorts. In 56.87% of cases, death was labeled from coronary artery disease (CAD), either from evidence of myocardial infarction or from the identification of severe coronary stenosis, which induced ischemia-related arrhythmias [28]. This percentage is not much different than the one reported in other studies, which attributed nearly 40% of deaths to ischemic heart disease[33]. However, in other reports the percentage of CAD neared 80%. The difference in our percentage is probably due to the inclusion of population only younger than 50 years of age in our cohort. The percentage of CAD-related death increased with age and was highest in population above 40 years old, as it was expected. In 2015, Vassalini et al reported the presence of ischaemic alterations in 18.5% of a cohort of patients aged less than 40 years, while other studies have underlined higher incidences of coronary related SCD, with percentages ranging between 48 and 73% [34–38]. These discrepancies can be explained by the different diagnostic criteria used in sample selection and age cut-off.

Regarding the situation of death, most CAD-related SD occurred in population older than 40 years of age, and during daily activity or stress/exercise. In the young population, most cardiomyopathy-related cases died during stress/exercise. These results are in concordance with other published cohorts and well-known data about exercise being a significant risk factor for cardiac death.

Macroscopic autopsy was able to define the cause of death in most cases above age 30. However, in cases below age 30, a negative macroscopic autopsy was the most common scenario. After adding histological analysis, an additional 17% of cases were labeled as of cardiac origin, cardiomyopathy or coronary artery disease, increasing the total percentage of cardiac origin to 46%, with CAD totaling 28.5%. In the young population, the main cause of death was from cardiomyopathies and in younger than 10 years of age, inherited cardiac diseases were the primary cause, also similar to published reports [39–42]. Nearly 19% of our cases remained as a negative autopsy, in concordance with a recent publication of Vassalini et al [43]. In other reports this percentage ranges from 5% to 40%, probably related to the study cohort as well as autopsy protocols [33, 44].

In 2015, the Swiss Society of Legal Medicine created a multidisciplinary working group, clinical and molecular geneticists together with cardiologists, in the hope of harmonizing the approach to the investigation of SCD. The key points of the recommendations were (1.) the realization of a forensic autopsy procedure for all SCD victims under 40 years of age (molecular autopsy or post-mortem genetic testing), (2.) the collection and storage of adequate samples for genetic testing, (3.) communication with the families, and (4.) a multidisciplinary approach including cardiac genetic counseling[19]. Though, despite these recommendations and the increasing availability of NGS technology, it is yet seldom performed in most forensic centers as part of the autopsy. A current matter of argue is who should pay the genetic test. In our opinion, public health system should assume the cost of these cardiac genetic analysis due to it is well established that genetic test in cases without conclusive cause of death help to identify the cause of death in a high number of cases. In addition, these genetic tests also help clinicians in identification of genetic carriers in family members, doing prevention of SCD in relatives at risk.

Similarly, according to recent cardiology guidelines [45], the use of molecular autopsy should be considered in the event of an unexplained sudden cardiac death with a suspicion of inherited disease. It remains unclear when to suspect an inherited cardiac disease in most



cases, as death is often the first clinical manifestation in the families. According to these same guidelines, the identification of a pathogenic variant associated with long QT syndrome or with CPVT is diagnostic of the disease. Thus, taking these data into account, the use of molecular autopsy appears mandatory in order to attempt to provide a diagnosis, which may benefit the identification of family members at risk.

For that reason, the aim of our work was to evaluate whether molecular autopsy could increase the identification of a potential etiology of death. Thus, we performed genetic investigation in all cases classified as microscopic cardiomyopathy as well as in those that remained unexplained after macro and microscopic autopsy. Thirty-two samples were reclassified as cardiomyopathies after identification of positive histological alterations. Out of these 32 samples, 19 showed histological changes consistent with a diagnosis of HCM. These results agree with several studies that report that HCM is the most prevalent cardiomyopathy associated with SCD. After genetic analysis, 33.9% of cases carried at least one PPV or DM variant, most variants remaining as VUS.

In addition, we genetically analyzed 119 samples classified as negative autopsy cases. Genetic analysis identified 41.19% of cases carrying at least one PPV or DM variant, remaining most variants as VUS. This percentage is in concordance with other genetic studies performed with NGS panels in autopsy samples [46, 47]. In post-mortem studies in which only a few genes were analyzed frequencies of detection differ between 11 to 26% [21, 28, 48-51]. Our percentage is higher due to the largest number of analyzed genes. Of 119 cases classified as unexplained death, around 40% carry a potentially pathogenic variant. Concretely, in our cohort, in the population younger than 31 years of age, the percentage of potentially pathogenic rare variants was 40.4%. Some reports have established that between 10% to 25% of SUD in the adult, and up to one-third in infantile and juvenile SUD, may be explained by cardiac channelopathies [8-11]. In most of these studies, the analysis was limited to the main genes associated with channel opathies. Our higher percentage may be due to a comprehensive genetic analysis including both genes associated with channel opathies and genes associated with cardiomyopathies, recently associated with arrhythmic pathologies without any structural alteration [52, 53]. In concordance with our results, recent studies performed in post-mortem samples using NGS technology showed percentages of rare variants potentially pathogenic in 30%-40% of samples analyzed [24-26, 54-58].

Out of 119 samples, we identified 21 DM variants in 16 cases (13.44%). Of these, 5 variants were potentially responsible for LQT, and 2 for BrS. Recent guidelines recommend the use of post-mortem genetic testing in cases with clinical evidence suggesting a diagnosis of LQTS or CPVT [29, 45]. Therefore, and according to the guidelines, a diagnosis was reached as a cause of death. In addition, 51 PPV were identified in 38 cases (31.92%). While their pathogenic role cannot be fully defined, the potential for an inherited disease makes it essential to further investigate the family members for segregation. In a recent report, Bagnall et al performed a NGS analysis in a post-mortem cohort of 490 samples died suddenly between 1–35 years old [28]. They identify nearly 35% of genetic variants classified as VUS and family segregation clarify the role of nearly 15% of cases concluding that autopsy investigation combined with genetic testing and family screening is the best way to identify a conclusive cause of death in cases died suddenly.

## Overlapping diseases/genes

In our study we have identified samples classified as cardiomyopathies but carrying rare variants in genes encoding ion channels and/or associated proteins. Similarly, we have also identified samples classified as negative autopsy (potential channelopathy) but carrying rare variants



in genes encoding structural proteins. Several studies have reported the potential pathophysiological mechanisms linking both entities in common genes. Thus, for example, *PKP2* (encoding plakophilin-2), is the main gene associated with AC and has been reported playing a pathogenic role in BrS [52, 53] despite additional studies in large cohorts should be performed to clarify this point [59]. In addition, alterations in *SCN5A* (encoding the sodium channel), the main gene associated with BrS, have been reported in 1–2% cases of DCM [60], and even AC [61]. In concordance with similar results from recent studies [62], this could suggest that a malignant arrhythmia could appear in early stage before a structural alteration is developed. However, further studies in larger cohorts should be performed to prove or refute this hypothesis.

# Compound/Multigenic variants

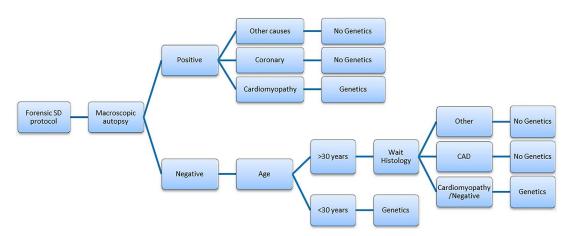
In almost 50% of samples, more than one rare genetic variant was identified, even in the same gene in some cases. Most of these rare genetic variants are at present of unknown significance. However, whether they have a role in the final risk of sudden cardiac death is unknown. Their potential effect as genetic modifiers (either detrimental or protective) of the phenotype is well accepted, but larger and more comprehensive studies will be needed to obtain conclusive data.

## Limitations

The first and main limitation already mentioned above is the lack of family members in order to perform a clinical-genetic segregation. The family segregation is crucial to clarify the role of identified genetic variants in each case/family. In addition, functional studies could help elucidate the pathogenic role of the variants in arrhythmogenesis but *in vitro* evidence of channel dysfunction associated with specific variants may not necessarily directly translate into a clinical phenotype in the complex biological environment of the human cardiovascular system. Finally, cases without any identified genetic variation could carry a defect in other genes not included in our NGS custom-panel.

#### Conclusions

In a prospective cohort of 789 cases of natural death, younger than 50 years of age, we show that cardiac alterations are the most common cause of death, concretely coronary artery



**Fig 6. Proposal of flow chart as forensic protocol guide for Sudden Death cases.** In cases less than 30 years old with a negative macroscopic autopsy or cases suspected of cardiomyopathy should be studied by genetics. Older cases must wait for histological analyses before be studied by genetics.



disease. While forensic investigation can determine the cause of death in most cases, nearly 19% of cases remain unanswered after a thorough autopsy investigation. The use of NGS genetic analysis has been advocated as an important complement to the investigation of death, and the incorporation of molecular autopsy in current guidelines attest to its value, according to the experts. The molecular autopsy may help identify the cause of death in a large percentage of cases remaining as negative after autopsy. In our cases without conclusive cause of death, we identified nearly 35% of PPV and nearly 15% of DM variants therefore reaching a conclusive diagnosis according to the guidelines. In our study we show that genetic analysis should be performed when there is a suspicion for an inherited cardiac disease after macroscopic or histological analysis, and when all tests have excluded a cause of death. Of notice, in SUD victims older than 30, it is important to exclude coronary disease by histology before proceeding with molecular autopsy, as this is the most common cause of death in that population. Our data show that before age 30, despite histological analysis should be performed in order to identify any microscopic alteration, the genetic analysis should be undertaken right away because the percentage of microscopic cardiac alterations is very low. In addition, even when histology identifies any microscopic cardiac alteration, the genetic results are a helpful complement of alterations identified in order to conclude cause of death. Consequently, we have proposed a simple forensic recommendation about molecular autopsy in Sudden Death cases (Fig 6). The evaluation of relatives should include an appropriate genetic counseling and will allow the implementation of preventive measures to the relatives at risk to prevent new cases of SCD.

#### **Author Contributions**

Conceptualization: OS RB JB J Medallo JC GS.

Data curation: J Mates CA CF EC AI.

Formal analysis: OS OC J Mates CA CF.

Funding acquisition: OC RB.

**Investigation:** OS OC AF GS SC.

**Methodology:** EA JCB AV NB CT.

**Resources:** FP AH JC NB.

**Software:** J Mates CA CF.

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**Validation:** IM AP MC FP AI EC CT.

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