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Actionable secondary findings in the 73 ACMG-recommended genes in 1559 Thai exomes

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High-throughput DNA sequencing provides not only primary diagnosis but also makes available other genetic variants with potential health implications. the American College of Medical Genetics and Genomics (ACMG) has recommended a list of medically actionable genes since 2013 and very recently released an updated ACMG SF v3.0 list comprising 73 genes. Here, we analyzed exome data of 1559 unrelated Thai individuals to determine the frequency and spectrum of pathogenic (P) or likely pathogenic (LP) variants in the 73 genes. Based on the ACMG guidelines for the interpretation of sequence variants, 68 different P/ LP variants in 26 genes associated with 18 diseases inherited in an autosomal-dominant manner of 186 individuals (11.9%; 186/ 1559) were identified. Of these, 22 P/LP variants in 15 genes associated with 13 diseases of 85 individuals (5.5%; 85/1559) were also reported as P/LP in the ClinVar archive. The majority harbored variants in genes related to cardiovascular diseases (4.7%; 74/1559), followed by cancer phenotypes (0.5%; 8/1559). None of the individuals in our cohort harbored biallelic variants in genes responsible for diseases inherited in an autosomal recessive manner. The results would serve as a basis for precision medicine practice at individual and population levels.

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INTRODUCTION

High-throughput DNA sequencing including genome sequencing (GS) and exome sequencing (ES) has increasingly been used in clinical medicine to guide patient care, mainly owing to the improved efficiency of analyzing and interpreting genomic data and its less-expensive cost [1]. Not only giving the molecular diagnosis for the presenting symptoms, GS/ES would also offer genetic variants in other genes. The variants in disease-causing genes unrelated to the patient's primary diagnosis but have the potential medical value are defined as secondary findings (SFs). SFs may help prevent a disease from occurring and guide the management if the disease develops.

In 2013, the American College of Medical Genetics and Genomics (ACMG) released recommendations and encouraged the evaluation for reporting of pathogenic (P) or likely pathogenic (LP) variants in 56 medically actionable genes of 24 different diseases [2]. In 2017, ACMG SF v2.0 has revised the list to 59 actionable genes of 27 various diseases [3]. Using this SF v2.0, studies of 196 Koreans [4], 1116 Hong Kong Chineses [5], 280 Lebaneses [6], 161 Taiwaneses [7], 954 East Asians [8], and 1005 Qatari people [9] demonstrated frequencies of SFs ranging from 1 to 9% [10].

Very recently, the list of actionable genes was updated in 2021 to include a total of 73 genes for 35 phenotypes [11]. Evidencebased guidelines were also recommended by ACMG, the Association for Molecular Pathology (AMP), and the College of American Pathologists (CAP) in 2015 for the assessment of evidence to standardize the interpretation of genetic variants [12]. The ACMG Secondary Findings Maintenance Working Group (SFWG) also updated the policy statement on the SF gene list in 2021 [13]. An increase of 14 genes from ACMG SF v2.0 list to 73 genes in the SF v3.0 list would likely increase the frequency of SFs. Of the 14 newly added genes, three genes are related to cancer (*PALB2, MAX, TMEM127*), four to cardiovascular (*CASQ2, TRDN, FLNC, TTN*), two to inborn errors of metabolism (*BTD, GAA*), and four to miscellaneous phenotypes (*HFE, ACVRL1, ENG, HNF1A, RPE65*).

Here, we analyzed exomes of 1559 unrelated Thais to determine the frequency and spectrum of SFs in the newly updated SF v3.0 list of ACMG 73 medically actionable genes, which could be used as a basis to improve the Thai population's healthcare.

MATERIAL AND METHODS Study samples

Exomes of 1565 unrelated Thai individuals who were parents of patients with various rare diseases were recruited. Informed consent was obtained from each individual. The study was approved by the Institutional Review Board of the Faculty of Medicine, Chulalongkorn University.

Sequencing and variant calling

Genomic DNA was extracted from peripheral blood leukocytes. The DNA samples were prepared as an Illumina sequencing library enriched by either TruSeq® Exome Kit (Illumina, San Diego, CA) or SureSelect Human All Exons, reagents (Agilent Inc,[®] Santa Clara, CA) according to the

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Fig. 1 Schematic workflow of the secondary findings (SFs)

manufacturer's standard protocol. Sequencing was performed on the NextSeq 500 or Hiseq 4000 Systems.

Reads files (FASTQ) were generated from the sequencing platform. Reads were aligned to the human reference genome (GRCh37) using the Burrows-Wheeler Aligner package v 0.7.15 [14]. Variant calling was performed using the Genome Analysis Tool Kit (GATK Best Practice V3.7, Broad Institute), which is called by HaplotypeCaller [15].

Ancestry estimation

Our samples were mixed with the samples from the 1000 Genomes Project by PLINK 1.90 beta 6.9 and visualize principal component analysis (PCA) in R package. Samples that did not cluster together were removed.

Variant annotation and interpretation

To annotate genetic variants, we used ANNOVAR, which uses data from different databases including RefGene (20190929 version), dbSNP150 (avsnp150; 20170929), ljb26_all (20140925 version), and Clinvar (20210120 version) [16] ANNOVAR also provided allele frequencies across global populations from respective data sets including the ESP (esp6500siv2_all; 20141222 version), ExAC project (exac03;20151129 version), 1000 Genomes project (1000g2015aug_all;20150824 version), and gnomAD (20190323 version). The variant interpretation was limited to the 73 actionable genes [11]. We included only variants that have allele frequencies <1%, quality genotype (DP) > 15, quality score >20, and were reported as P/LP by VarSome's ACMG classification [17]. Then, we removed variants present in both the participants and their children which were responsible for the children's presenting symptoms and excluded

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monoallelic variants in autosomal recessive genes. Finally, we described variants that were also reported as P/LP in Clinvar aggregate records (VCV) (see Fig. 1 for the schematic workflow).

RESULTS

Of the 1565 exomes, six were removed because they did not cluster with the majority. The final cohort is clustered with the East Asian population (Fig. 2) and consists of 1559 samples with 769 males and 790 females. ES allowed us to detect 14,089 variants in the 73 selected genes. Using the filtering criteria for pathogenicity based on ACMG guidelines, 95 P/LP variants in 34 genes of 230 individuals were identified (Supplementary Table S1). Four individuals harbored variants in the genes responsible for the presenting symptoms in their children and were excluded. These include a *RET* missense variant, c.1438 G > A (p.Glu480Lys), leading to multiple endocrine neoplasia type 2 and three variants in *ATP7B*, c.3316 G > A (p.Val1106IIe), c.3426 G > C (p.Gln1142His) and c.1708-1 G > C, causing Wilson disease in their affected children (individuals with the red fonts in Supplementary Table S1).

According to the ACMG recommendations, the second finding of recessive diseases should only be returned when the individual carries biallelic mutations in the same gene. Forty individuals were identified to carry monoallelic P/LP variants in eight autosomal recessive disorders and were excluded (Supplementary Table S1).



Fig. 2 A Principal component analysis was performed by comparing our 1565 exome data with 1000 Genome Project. 1559 exomes were clustered together while the six exomes represented by triangles were excluded from further analyses. *EUR* European, *EAS* East Asian, *AMR* admixed American, *SAS* South Asian, *AFR* African

Based on the ACMG guidelines for the interpretation of sequence variants, this resulted in a set of 68 different P/LP variants in 26 genes associated with 18 diseases inherited in an autosomal-dominant manner of 186 individuals (11.9%; 186/1559). Of these, 22 unique P/LP variants in 15 genes of 85 individuals (5.5%; 85/1559) were also reported as P/LP in the ClinVar archive. The 15 genes are associated with 13 autosomal-dominant diseases, which can be classified into three specific phenotype categories: cancer, cardiovascular, and miscellaneous phenotypes (Table 1).

SFs associated with oncogenic diseases were found in eight individuals representing 9.4% (8/85) of the individuals with SFs and 0.5% (8/1559) of our cohort. The most prevalent variants were c.802-2 A > G (rs587782455) in *PTEN* associated with PTEN hamartoma tumor syndromes.

Variants in genes related to cardiovascular diseases were detected in 74 individuals, representing 87% (74/85) of the patients with identified SFs and 4.7% (74/1559) of our cohort. The most prevalent variant in this phenotypic category is c. 1019 C > T (p.Thr340Met; rs34833812) in *TGFBR2* responsible for Loeys-Dietz syndrome 2 found in 19 individuals. For cardiomyopathies, c.1000 G > A (p.Glu334Lys; rs573916965) in *MYBPC3* found in 16 individuals is the most common one. Regarding arrhythmic phenotype, the most prevalent variant is c.3507 C > A

(p.Tyr1169Ter; rs148894066) in *DSP* causing arrhythmogenic right ventricular cardiomyopathy (ARVC) observed in 9 individuals (0.6%; 9/1559). Notably, 10 individuals harbored c.1056 C > A (p. Cys352Ter; rs13306515) in *LDLR*-associated with familial hypercholesterolemia (FH) and cardiovascular disease.

DISCUSSION

GS/ES offers SFs with the potential to improve healthcare. The extent of their benefits relates to their frequency, which depends on the number of analyzed genes and varies by ethnic background. The most widely used list of medically actionable genes is recommended by ACMG, which increases from 56 genes in 2013, and 59 genes in 2017 to 73 genes in 2021. This would likely increase the frequency of SFs and the benefits of performing GS/ES.

Of the identified SFs in our Thai cohort, genes associated with cardiovascular phenotype were the most frequently mutated (4.7%; 74/1559). In all, 2.2% of our cohort (35/1559) risk for cardiomyopathy including hypertrophic cardiomyopathy (HCM), dilated cardiomyopathy, and arrhythmogenic cardiomyopathy. HCM has been reported to be the most prevalent genetic cardiac disease with prevalences estimated at 1 in 500 to 1 in 200 individuals [18]. If all the P/LP variants identified in our cohort lead to diseases, the prevalence of HCM in our Thai population would be 1 in 92 (17/1559). Notably, P/LP in TGFBR2 were found in 19 individuals, leading to the prevalence of hereditary connective tissue disorders including Loeys-Dietz syndrome 2, and familial thoracic aortic aneurysms in our Thai population of 1 in 83 (19/ 1559). If aortopathy is identified as presymptomatic, an available effective intervention such as a prophylactic aortic surgery could save lives [19].

FH is an autosomal dominant disease, with a significantly increased cardiovascular risk. FH is a common genetic disease with an incidence of 0.2–0.5% worldwide [20]. Our finding of 0.9% or 1 in 104 individuals (15/1559) is consistent with the high frequencies found in Southeast Asian countries including 1.4% in Malaysian, and ~1% in Filipino and Vietnamese [21].

In all, 0.5% (8/1559) of our cohort are in the cancer phenotype category. Six P/LP variants were found in *PTEN* associated with PTEN hamartoma tumor syndromes. These syndromes include Cowden syndrome (CS), Lhermitte–Duclos disease (LD), Bannayan–Riley–Ruvalcaba syndrome (BRRS), and possibly Proteus syndrome (PS). Variants in *BRCA1*, *BRCA2*, and *PALB2* for breast and/or ovarian cancer have a prevalence of 0.13% (2/1559) or 1 in 780, similar to the previous estimation of 0.12–0.25% in other ethnics [22].

All SFs identified in our Thai cohort are associated with autosomal dominant diseases. Actually, 24 monoallelic P/LP variants in eight genes, ATP7B, BTD, CASQ2, GAA, HFE, MUTYH, RPE65, and TRDN, are responsible for autosomal recessive diseases were found in 40 individuals representing 2.6% of our cohort. In all, 17 out of these 24 P/LP variants in eight genes of 30 individuals were also reported as P/LP in the ClinVar archive (Supplementary Table S1). Variants in ATP7B responsible for Wilson disease were found in 16 individuals (1% of our cohort). This frequency is lower than those in Hong Kong Chinese (1.3%), Lebanese (1.4%), Korean (2%), Taiwanese (3.1%), and French (3.2%) [5-7, 23, 24]. Two individuals (0.1%) of our cohort carried P/LP variants in MUTYH, which increases the lifetime risk of colorectal cancer. It is much lower than 1-2% of monoallelic found in the Caucasian population [25]. As the ACMG recommends to return SFs of recessive diseases only when the individuals harbor biallelic P/LP variants and all in our cohort carried monoallelic variants, these SFs, therefore, are not included as actionable in our study. Nonetheless, these variants may still be relevant to the individuals if the other allele is actually present but unidentified by the technique or when they plan to have children.

Table 1. Disease	phenotypes with the 2.	2 pathoge	nic/likely pathc	ogenic variants	as secondary	findings in 15 gen	es of 85 unrelated T	hai individuals			
Phenotype	Disease	Gene	Individuals	di ansdb	Genomic position	RefSeq mRNA	Nucleotide change	Amino acid change	ACMG classification	Evidence	Clinvar classification
Cancer (8)	Hereditary breast and ovarian cancer (2)	BRCA1	-	rs80357251	chr17: 41244913	NM_007300.4	c.2635 G > T	p.Glu879Ter	۵.	PVS1, PP5,PM2, PP3	٩
		PALB2	-	rs747148023	chr16: 23641062	NM_024675.4	c.2411_2412del	p.Ser804CysfsTer10	٩.	PVS1, PP5,PM2	P/LP
	PTEN hamartoma tumor syndrome(6)	PTEN	Q	rs587782455	chr10: 89720649	NM_000314.8	c.802-2 A > G	NA	۵.	PVS1, PP5,PM2, PP3	٩
Cardiovascular (74)	Aortopathies (19)	TGFBR2	19	rs34833812	chr3: 30713619	NM_003242.6	c.1019 C > T	p.Thr340Met	4	PM1,PP2, PP3,PP5, BS2	CIP;B(3), LB (5), LP (1), VUS(2)
	Arrhythmogenic right ventricular cardiomyopathy(10)	DSP	6	rs148894066	chr60: 7579930	NM_004415.4	c.3507 C > A	р.Туr1 169Ter	٩	PVS1, PM2, PP3,PP5	ГЪ
		PKP2	-	NA	chr12: 32994140	NM_004572.4	c.1511-1 G > C	NA	۵.	PVS1, PM2, PP3,PP5	٩
	Catecholaminergic polymorphic ventricular tachycardia(1)	RYR2	-	rs794728707	chr1: 237540658	NM_001035.3	c.499 A > G	p.Lys167Glu	<u>-</u>	PM1, PM2,PP3, PP5	4
	Dilated cardiomyopathy(8)	TNNT2	Q	rs397516484	chr1: 201328372	NM_001276345.2	c.863 G > C	p.Arg288Pro	Ъ	PM2, PM5, PP2,PP3	CIP;LP(4),P (1), VUS(1)
		NLL	-	rs886038916	chr2: 179418821	NM_001256850.1	c.84094 C > T	p.Arg28032Ter	۵.	PVS1, PP5, PM2,PP3	P/LP
			-	rs1057522831	chr2: 179415988	NM_001256850.1	c.86348-1 G > A	NA	۵.	PVS1, PM2, PP3,PP5	Ч
	Familial hypercholesterolemia	LDLR	-	rs112029328	chr19: 11213463	NM_000527.5	c.313 + 1 G > A	NA	ď	PVS1, PM2, PP3	CIP; LB(1), LP (2), P(17)
	(15)		-	rs201102461	chr19: 11215926	NM_000527.5	c.344 G > A	p.Arg115His	Ч	PM1, PM2,PP2	CIP;LB(1),LP (2), P(1),VUS (3)
			m	rs730882109	chr19: 11227576	NM_000527.5	c.1747C > T	p.His583Tyr	٩	PM1, PM2, PM5,PP2, PP3	CIP;LB(1),LP (5), P(7),VUS (1)
			10	rs13306515	chr19: 11221443	NM_000527.5	c.1056 C > A	p.Cys352Ter	۵.	PVS1, PM2,PP5, PP3	P/LP
	Hypertrophic cardiomyopathy(17)	MYBPC3	16	rs573916965	chr11: 47364637	NM_000256.3	c.1000 G > A	p.Glu334Lys	Ч	PM2,PP2, PP3, PP5	CIP;B(2),LP(1), P(2),VUS(6)
		ZHYM	-	rs397516142	chr14: 23894566	NM_000257.4	c.2348 G > A	p.Arg783His	4	PM1, PM2, PM5,PP2, BP4	CIP;LP(3),VUS (3)
	Long QT syndrome types 1 and 2 (2)	KCNQ1	-	rs199472776	chr11: 2608860	NM_000218.3	c.1189 C > T	p.Arg397Trp	Ч	PM2, PM5, PP2, PP3	CIP;B(1),LP (3), VUS(9)
			-	rs199472737	chr11: 2594172	NM_000218.3	c.877 C > T	p.Arg293Cys	Ч	PM2,PP2, PP3, PP5	CIP;LP(1),VUS (5)

38951020 PM2, (1),VUS(2) PM2, (1),VUS(2) PM2, (1),VUS(2) PP2, PP3 PP2, PP3, PP3, PP3, PP3, PP3,
48 chr19: NM_000540.3 c.130 C > T p.Arg44Cys LP PM2,PP2, ClPLP(1) 38931469 PP3,PP5 VUS(8)

This study was the first to provide the prevalence of SFs from ES in a Thai population. Most are related to cardiovascular and cancer phenotypes. Early surveillance is critical to decreasing the risk of developing diseases and sudden death. The information would serve as a basis for precision medicine practice for the Thai population.

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AUTHOR CONTRIBUTIONS

W.C.: data curation, formal analysis, and writing the original draft; V.S.: conceptualization, funding acquisition, and editing the manuscript.

COMPETING INTERESTS

The authors declare no competing interests.

ADDITIONAL INFORMATION

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