Leukocytes carrying *Clonal Hematopoiesis of Indeterminate Potential* (CHIP) Mutations invade Human Atherosclerotic Plaques

Short title: CHIP in atherosclerotic plaque

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Background: Leukocyte progenitors derived from clonal hematopoiesis of undetermined potential (CHIP) are associated with increased cardiovascular events. However, the prevalence and functional relevance of CHIP in coronary artery disease (CAD) are unclear, and cells affected by CHIP have not been detected in human atherosclerotic plaques.

Methods: CHIP mutations in blood and tissues were identified by targeted deep-DNAsequencing (DNAseq: coverage >3,000) and whole-genome-sequencing (WGS: coverage
>35). CHIP-mutated leukocytes were visualized in human atherosclerotic plaques by
mutaFISHTM. Functional relevance of CHIP mutations was studied by RNAseq.

9 Results: DNAseg of whole blood from 540 deceased CAD patients of the Munich 10 cardlovaScular Studles biObaNk (MISSION) identified 253 (46.9%) CHIP mutation carriers 11 (mean age 78.3 years). DNAseg on myocardium, atherosclerotic coronary and carotid arteries detected identical CHIP mutations in 18 out of 25 mutation carriers in tissue DNA. MutaFISH[™] 12 13 visualized individual macrophages carrying DNMT3A CHIP mutations in human atherosclerotic 14 plaques. Studying monocyte-derived macrophages from Stockholm-Tartu Atherosclerosis 15 Reverse Networks Engineering Task (STARNET; n=941) by WGS revealed CHIP mutations 16 in 14.2% (mean age 67.1 years). RNAseg of these macrophages revealed that expression 17 patterns in CHIP mutation carriers differed substantially from those of non-carriers. Moreover, 18 patterns were different depending on the underlying mutations, e.g. those carrying TET2 19 mutations predominantly displayed upregulated inflammatory signaling whereas ASXL1 20 mutations showed stronger effects on metabolic pathways.

Conclusions: Deep-DNA-sequencing reveals a high prevalence of CHIP mutations in whole blood of CAD patients. CHIP-affected leukocytes invade plaques in human coronary arteries. RNAseq data obtained from macrophages of CHIP-affected patients suggest that proatherosclerotic signaling differs depending on the underlying mutations. Further studies are necessary to understand whether specific pathways affected by CHIP mutations may be targeted for personalized treatment.

- 27 Key words: aging, atherosclerotic cardiovascular disease, clonal hematopoiesis of
- 28 indeterminate potential, coronary artery disease, inflammation

29 Introduction

30 Clonal hematopoiesis of undetermined potential (CHIP) is a common age-related condition 31 and potential precursor to hematological neoplasms. CHIP is defined as presence of a clonally 32 expanded hematopoietic cell caused by a somatic mutation in individuals without hematologic 33 abnormalities. Such mutations, predominantly in the epigenetic regulators DNMT3A, TET2 or 34 ASXL1, have been identified in bone marrow and blood, but these cells have never been definitively detected in human atherosclerotic plaques.¹ Whole-exome sequencing has shown 35 that CHIP is practically absent in individuals younger than 30 years of age, whereas it is 36 37 present in 20% to 30% of individuals aged 50 to 60 years.^{1, 2} The use of more sensitive 38 sequencing techniques and access to bone marrow has demonstrated that small clones are quite common in middle-aged individuals.^{3, 4} CHIP carriers have an increased risk of 39 40 cardiovascular events and mortality, including early onset and aggravated progression of 41 coronary artery disease (CAD), myocardial infarction, stroke, aortic valve calcification and 42 chronic ischemic heart failure.⁵⁻⁸ The higher the burden of CHIP-affected cells measured by 43 the variant allele frequency (VAF), the higher was the reported risk of adverse events.⁵⁻⁸ 44 Indeed, detection of CHIP in peripheral blood may serve as a biomarker for adverse outcomes in individuals with cardiovascular diseases (CVDs). 45

46 Experimental studies deciphered the first mechanistic insights explaining the associations of 47 CHIP mutations with CVD. Fuster et al. demonstrated that transplantation of bone marrow 48 containing a Tet2 loss-of-function mutation in hematopoietic cells in mice mimics the human 49 situation of CHIP including increased numbers of activated macrophages (measured by upregulation of $IL-1\beta$ found in plaques. Aggravated atherosclerosis was triggered by activation 50 51 of the inflammatory cascade in these cells. Further, in-vitro LPS-stimulation of macrophages 52 carrying somatic mutations led to increased expression of IL-6, the downstream mediator of 53 the inflammasome complex, and $IL-1\beta$.⁹

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54 Our current understanding is that driver mutations in DNMT3A, TET2 or ASXL1 lead to 55 expansion of clones in the bone marrow resulting in increased numbers of cells with epigenetic 56 alterations in the peripheral blood. These changes result in increased expression of genes 57 associated with inflammatory pathways, which in turn may stimulate the progression of atherosclerosis.¹⁰ Here we studied the prevalence of CHIP in DNA sequence data, whether 58 59 CHIP-mutated leukocytes invade atherosclerotic plaques in human arteries and whether 60 macrophages isolated from CAD patients carrying specific CHIP mutations also present with 61 specific CAD signatures by examining macrophage RNA-expression profiles and associated 62 clinical phenotypes (Figure 1).

63 Materials and Methods

64 Ethics approval

The institutional review board and Ethics Committee of the Technical University of Munich, 65 66 Germany, approved the protocol of MISSION (2018-325-S-KK - 08/22/2018). The use of human STARNET samples has been approved by the Estonian Bioethics and Human 67 Research Committee (Ministry of Social Affairs) (IRB 2771T,17 - 12/01/2018) and by the 68 69 written informed consent of the donor, in accordance with the guidelines and regulations for 70 the use of biological material of human origin. Both studies were conducted in accordance with 71 the provisions of the Declaration of Helsinki and the International Conference on 72 Harmonization guidelines for good clinical practice.

73 Data accessibility

74 Data used in this study are available in permanent repositories. Human data from MISSION 75 can be requested by qualified researchers at the German Heart Center Munich from the 76 corresponding author. Human data from STARNET are accessible through the Database of 77 Genotypes and Phenotypes (dbGAP).

78 **MISSION – cohort and sample description**

79 The Munich cardlovaScular Studles biObaNk (MISSION) was started in 2019 and comprises cardiovascular relevant tissues, including blood and plasma, liver, myocardium, coronary, and 80 81 carotid samples from >950 deceased individuals sampled in FFPE and fresh frozen at -80°C. 82 Prior to freezing and sequencing, all tissues are washed and subsequently conserved in 83 PBS/DMSO. MISSION provides the full spectrum of coronary phenotypes from healthy to 84 severe atherosclerosis. DNA of leukocytes and cardiovascular tissues was analyzed by deep-85 targeted-amplicon-sequencing. The leukocytes derived from whole blood, and the analyzed 86 tissue encompassed the proximal part of atherosclerosis-affected left anterior descending 87 (LAD) coronary, atherosclerosis-affected left carotid artery and left ventricular heart muscle.

88 DNA extraction from blood and tissue

89 For the extraction of DNA from whole blood, the Maxwell DNA Blood Kit (Promega) was used. 90 For this purpose, whole blood was incubated for 20 minutes at room temperature under rotation 91 (Rotating shaker, Kisker Biotech, Germany). Then, 300µl of whole blood was mixed with 300µl 92 of lysis buffer and 30µl of proteinase K. The mixture was incubated under rotation for 30 93 minutes at room temperature, followed by another 30 minutes at 65°C and 600rpm in a heat block (Thermomixer comfort, Eppendorf, Germany). Every 10 minutes, incubation was 94 95 performed at 1500rpm for approximately 1 minute. DNA extraction from human coronary 96 artery, carotid and left ventricle was performed based on 50mg of frozen tissue samples. 97 Perivascular tissue was removed from arteries and tissues were washed in 1x PBS. Isolation was performed based on a modified Maxwell DNA Blood kit (Promega) protocol. After 98 99 mechanical homogenization (TissueLyser II, Qiagen, The Netherlands) of the tissues in 300µl 100 incubation buffer, 1-thioglycerol and proteinase K were added. The mixture was incubated for 101 4 hours at 65°C and 600rpm in a heat block (Thermomixer comfort, Eppendorf, Germany). 102 This was followed by the addition of 300µl of lysis buffer and re-incubation for 10 minutes at 103 600rpm. Finally, the batches (blood and tissue) were transferred to the first well of the cartridge 104 included in the kit. After addition of the plunger, the cartridge was inserted into the Maxwell 105 RSC 48 system. The supplied elution tubes (0.5ml) were filled with 65µl of elution buffer and 106 also inserted into the instrument. Finally, the predefined Maxwell DNA Blood protocol was 107 selected and DNA was isolated in around 37 minutes. Isolated DNA was measured 108 fluorometrically with a Qubit 3.0 (ThermoScientific).

109 Sample preparation and DNA extraction

Whole blood and cardiovascular tissues were analyzed by deep-DNA-sequencing to detect hematopoietic stem cell derived mononuclear cells with CHIP mutations in cardiovascular relevant tissues. Samples were sequenced using an Illumina TruSeq Custom sequencing panel at the Munich Leukemia Laboratory. The concentration of extracted genomic DNA was determined with a Qubit dsDNA HS assay kit (Life Technologies) and then diluted to 25ng/µl in 30µl of nuclease free water. A depth of more than 1000 detections per gene was targeted
for sequencing to reliably detect CHIP-mutated hematopoietic cells in whole blood,
atherosclerosis-affected coronary and carotid artery, and myocardium of the left ventricle.

118 Deep-DNA-sequencing

119 A previously established panel containing 594 amplicons in 56 genes was used in the Illumina 120 TruSeq Custom Amplicon Low Input assay.⁶ To allow improved identification of low allele 121 frequency variants, double-strand sequencing was performed. In addition, 6-bp unique 122 molecular identifiers (UMIs) were included in the target-specific primers. Prior to sequencing, 123 pooled libraries were diluted and denatured according to the NextSeq System Denature and 124 Dilute Libraries Guide (Illumina). 1% PhiX DNA was added. Pooled libraries were sequenced 125 with the NextSeq 500 sequencer (Illumina) using the NextSeq 500/550 Mid Output, Version 2 126 kit (300 cycles) according to the manufacturer's instructions. The sequencer was run in paired-127 end sequencing mode with a read length of 2x150bp and an index read length of 2x8bp. The 128 BCL files were demultiplexed and converted to FASTQ files using the FASTQ Generation tool 129 on BaseSpace (Illumina). The average coverage of the samples was >3,000 per gene. The 130 variants were further validated on the basis of being reported in the literature and/or the 131 Catalogue of Somatic Mutations in Cancer (https://cancer.sanger.ac.uk/cosmic) and ClinVar 132 (https://www.ncbi.nlm.nih.gov/clinvar). The 56 gene panel was adapted after screening the first 133 n=192 individuals to a custom 13 gene panel comprising ASXL1, CALR, CBL, DNMT3A, JAK2, 134 MPL, PPM1D, SF3B1, SRSF2, TET2, TP53, U2AF1 and ZRSR2, thereby covering almost 90% 135 of known CHIP mutations. The 13 gene panel followed the same analysis pipeline.

136 Visualization of specific CHIP mutations in human plaques

Mutation specific Fluorescence In Situ Hybridization (mutaFISH[™]) analysis on *DNMT3A* gene was performed on 3-5µm thick tissue sections from human coronary and carotid arteries of patients with known mutation (c.2245C>T and c.2333T>G) in the *DNMT3A* gene. In situ rolling circle technology was performed using custom made dual color *DNMT3A* mutation and 141 wildtype specific FISH probes (Abnova, Taiwan). The detailed protocol used for pretreatment, 142 reverse transcription, hybridization, amplification and signal detection is provided in the supplement. It is based on the manufacturers protocol for mutaFISH[™] RNA Accessory Kit and 143 the protocol for muta FISH[™] HER2wt RNA probes with some modifications in target retrieval, 144 145 washing buffer and incubation. Negative controls were used to establish unspecific binding 146 and background. All reagents were prepared with RNAse free (DEPC treated) water/PBS. For 147 hybridization a Boekel Scientific Slide Moat oven was used. Images were acquired at the 148 ZEISS Axioscan 7 slide scanner and analysis was performed using Zeiss Software ZEN 3.5 149 blue edition.

150 STARNET – Study and sample description

To further study the ability of CHIP-mutated leukocytes to invade atherosclerotic plaques and to identify their biological impact we leveraged the Stockholm-Tartu Atherosclerosis Reverse Networks Engineering Task (STARNET) study datasets. Briefly, patients with CAD undergoing coronary artery bypass grafting (CABG; n=941) donated multiple tissue samples that included liver, skeletal muscle, subcutaneous fat, visceral abdominal fat, atherosclerotic aortic wall, internal mammary artery and whole blood as previously described.¹¹ After quality control, WGS data of all 941 STARNET individuals were suitable for downstream CHIP analysis.

158 Whole genome sequencing

159 DNA from whole blood was isolated with the QIAmp DNA Blood Midi kit (Qiagen). DNA 160 qualities were assessed with the Agilent 2100 Bioanalyzer system (Agilent Technologies, Palo 161 Alto, CA). Library preparation and sequencing were performed at Beijing Genomic Institute 162 (BGI). Genomic DNA samples that passed quality control were randomly fragmented by 163 Covaris technology and 350bp fragments were selected. End repair of DNA fragments was 164 performed and an "A" base was added at the 3'-end of each strand. Adapters were then ligated 165 to both ends of the end repaired/dA tailed DNA fragments and amplified by ligation-mediated 166 PCR (LM-PCR), followed by single strand separation and cyclization. Rolling circle amplification was performed to produce DNA Nanoballs (DNBs). The qualified DNBs were loaded into patterned nanoarrays and pair-end reads were read through on the BGISEQ-500 platform. High-throughput sequencing was performed for each library to ensure that each sample met the average sequencing coverage requirement of 35x. Sequencing-derived raw image files were processed by BGISEQ-500 base-calling software with default parameters, and the sequence data of each individual was generated as paired-end reads.

173 Raw data in FASTQ format was filtered and raw reads with low quality were removed. Data
174 was aligned to the human reference genome (GRCh37/HG19) by Burrows-Wheeler Aligner
175 (BWA) v0.7.12 ^{12, 13} and variant calling was performed by Genome Analysis Toolkit (v3.3.0)¹⁴

176 with duplicate reads removed by Picard tools v1.118.¹⁵

177 The HaplotypeCaller of GATK was used to call both SNPs and InDels simultaneously via local

de-novo assembly of haplotypes in a region showing signs of variation.^{16, 17} Base guality scores

179 were recalibrated using GATK BaseRecalibrator and SNPs recalibration was performed using

180 GATK VariantRecalibrator function.^{18, 19}

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181 CHIP somatic variant identification and validation

Heterozygous missense, nonsense, InDel and splicing variants of one or two base pairs in coding regions of CHIP-associated genes including *ASXL1, TET2, JAK2,* and *DNMT3A* were identified by filtering data from vcf files according to: 1) genotype quality > 30; 2) minor allele frequency <1% in 1000 genome database; 3) minor allele frequency <1% in the cohort.

Variant analysis in RNAseq data in blood, aorta, liver, skeletal muscle, subcutaneous fat, visceral abdominal fat, monocyte derived macrophages and macrophage derived foam cells from STARNET subjects was performed for identification and validation of somatic mutations identified via whole genome sequencing. Because bone marrow or hematopoietic cells that carry somatic mutations could present in leukocytes in whole blood, in atherosclerotic plaques in the diseased aorta, or in macrophages and foam cells isolated and differentiated from whole blood, variants that presented in at least one of these four tissues/cell types but not in any

other tissues (liver, skeletal muscle, subcutaneous fat, visceral abdominal fat) were defined assomatic mutations.

195 RNA sequencing and data processing

196 The effects of CHIP mutations on gene expression were studied in macrophages and foam 197 cells. After centrifugation of whole blood, the cell pellet was washed with 1x PBS and cells 198 were plated. After 3-6 hours, the monocytes adhered to the plate and non-adherent 199 erythrocytes and lymphocytes could be washed off during adhesion purification. The 200 monocytes were subsequently cultured in human serum, stimulated and differentiated into 201 macrophages over 48-72 hours. The transition to foam cells was achieved by treatment with 202 oxidized low-density lipoprotein (LDL) cholesterol. Finally, the macrophages and foam cells 203 were harvested and RNA was isolated.¹¹

204 RNA library preparation was based on the Ribo-Zero library preparation method using Illumina 205 TruSeq nonstranded mRNA kit. Samples were randomized to prevent batch effects. 206 Sequencing was performed with paired-end reads of 100 base pairs on an Illumina HiSeq, and 207 quality control was performed using FASTQC3. GENCODE was used to quantify the 208 expression of genes and isoforms and mapped to the human genome using STAR4. The 209 average coverage was >40 million reads per sample. Only samples with more than 1 million 210 unambiguously assigned reads were used for further analysis.

211 Genetics, imputation and eQTL analysis

Genetic data were analyzed on a genome build 37 background using GenomeStudio (Illumina). After genetic sex confirmation, quality control was performed using PLINK v 2.05. Data were imputed using the HRC r1.1 2016 reference panel using minimac4. Cis- and transregulated expression quantitative trait loci (eQTLs) in macrophages were determined using R package matrix eQTL v.2.1.1. Adjustments were made for age, sex, BMI and the first five genetic principal components. Cis-regulatory SNPs within 1 megabase of the respective gene

were determined by a linear regression model (hg19 genomes). An FDR <5% was considered
statistically significant.

220 Differential gene expression and pathway analysis

221 Differences in gene expression between CHIP mutation carriers and controls were investigated using the R package limma. Covariates in the linear regression model were age, sex and BMI. 222 223 Adjusted p-values <0.05 were considered statistically significant. Differentially expressed 224 genes were analyzed for overrepresentation of genes from genome-wide association studies 225 (GWAS) to CAD using PhenoScanner. Differentially expressed genes were analyzed by 226 binomial test for enrichment of Gene Ontology (GO) terms and by Gene Set Enrichment 227 Analysis (GSEA). The maximum size of a gene set in GSEA was set to 3,000. Bonferroni-228 corrected p-values <0.05 were considered statistically significant.

229 Network and Key Driver Analysis

Regulatory networks were reconstructed using GENIE3, based on a random forests ensemble method.²⁰ The network was enriched with transcription factors and cis-eQTL-regulated genes from macrophages as candidate regulators.^{21, 22} Weighted key driver analysis (wKDA) was performed using mergeomics.^{23, 24} Mergeomics allows disease-relevant processes to be mapped onto molecular interaction networks in order to identify hubs as potential key regulators. The network visualization was realized with Cytoscape v3.7.0.

236 Co-expression modules and association with clinical traits

237 Correlation patterns between gene expression were analyzed using R package Weighted 238 Gene Co-expression Network Analysis (WGCNA) to construct correlation networks and 239 identify co-expression modules. Correlations of gene expression with clinical traits were 240 calculated using Spearman correlation. The association of co-expression modules with clinical 241 traits was analyzed using Fisher's exact test to calculate the enrichment of the number of 242 significantly correlated genes in each module.

243 Results

244 CHIP screening by deep DNA sequencing

245 In MISSION, a total of 540 individuals who died at an age between 40 to 98 years old (mean 246 age 75.1 years) were found to have CAD at autopsy. These subjects were screened for CHIP 247 mutations with a mean sequencing depth of 3,592-fold, with at least 1,000-fold per gene. A 248 total of 253 individuals (46.9%) carried 445 individual CHIP mutations in whole blood. The 249 prevalence of CHIP mutations increased with age (R=0.76; p<0.001), the mean age of 250 mutation carriers was 78.3 years and 113 (44.7%) were female. 78 individuals carried at least 251 one CHIP mutation with a VAF >10%, 130 individuals carried at least one CHIP mutation with 252 a VAF >2% and 45 individuals were identified with clonal hematopoiesis with a VAF <2% 253 (Supplemental Figure 1). The greatest burden of CHIP was found in an 85-year-old man who 254 carried 6 unique mutations. Most somatic mutations were identified in DNMT3A (155 255 mutations), TET2 (152) and ASXL1 (32). Further, CHIP mutations were detected in BCOR, 256 CBL, CALR, CBL, EZH2, GNAS, GNB1, IDH1, JAK2, KRAS, PPM1D, RAD21, SETBP1, 257 SF3B1, SMC1A, SMC3, SRSF2, TP53, U2AF1 and ZRSR2 (Supplemental Table 1).

The presence of CHIP mutations in cardiovascular tissues was studied on DNA level in a 258 259 subset of 25 confirmed CHIP mutation carriers. Specifically, we looked for respective mutations 260 in atherosclerosis-affected coronary and carotid arteries, and myocardium of the left ventricle. 261 Samples with VAF between 0.5% and 30.0% were analyzed. 18 identical CHIP mutations (i.e. 262 in 72.0% of cases) were identified in at least one corresponding tissue, whereas no de novo 263 mutation was detected on tissue level – serving as internal quality control. In 13 (52.0%) 264 atherosclerosis-affected samples of the proximal left anterior descending (LAD) coronary 265 artery CHIP mutations were retrieved: DNMT3A (5 mutations), TET2 (4), ASXL1 (1), CBL (1), 266 PPM1D (1), and SMC3 (1). In atherosclerosis-affected carotid artery samples 10 mutations in 267 DNMT3A (6 mutations), TET2 (3) and PPM1D (1) were identified, as well as 4 in the 268 myocardium of the left ventricle of atherosclerosis-affected individuals in DNMT3A (1), TET2

(2) and *SMC3* (1). In general, leukocytes are the only DNA-containing cells in whole blood. In
 arterial tissue, various cells - e.g. smooth muscle cells, endothelial cells, leukocytes - carry
 DNA. Given the low proportion of leukocytes in atherosclerotic arterial tissue, an enrichment
 of CHIP-affected leukocytes - as identified for PPM1D - is likely in plaques (<u>Table 1</u>,
 <u>Supplemental Figure 2</u>).

274 Visualization of specific CHIP mutations

275 To further detect and visualize specific point mutations of interest on RNA level in single cells 276 custom made mutaFISH[™] probes (Abnova, Taiwan) were designed.^{25, 26} The targeted DNMT3A mutations c.2245T>C and c.2333G>T, initially identified in whole blood of CAD 277 278 patients, were identified in leukocytes of the corresponding mutation carriers in human 279 atherosclerotic plaque (Figure 2). For optimal orientation, all arterial samples were also 280 stained for hematoxylin and eosin (HE) and Elastin van Gieson (EvG) (Supplemental Figure 281 3). Further, staining for CD68 revealed that CHIP-affected leukocytes in these cases could be 282 identified as macrophages (Supplemental Figure 4). CHIP-mutated macrophages were 283 mainly identified in the shoulder regions of advanced and inflammation rich plaques of human 284 coronary and carotid samples (Figure 2, Supplemental Figure 4+5).

285 CHIP screening by WGS

286 The 941 patients of the STARNET study undergoing open heart surgery were younger (65.9 287 years) and WGS sequencing had a lower depth (35-fold) than deep-DNAseq carried out in 288 MISSION.¹¹ Overall, 159 specific CHIP mutations in the genes ASXL1, DNMT3A, JAK2 or 289 TET2 were identified in 134 (14.2%) individuals in STARNET (Supplemental Table 2). Mean 290 age of these CHIP mutation carriers was 67.1 years and 27 (17.0%) were female. 51 CHIP 291 mutations could be confidentially replicated on RNA level in at least one tissue. Variant analysis 292 in RNAseq data confirmed the CHIP mutations at the RNA level in whole blood (43 mutations), 293 monocyte derived cultured macrophages (10 mutations) and cultured macrophage derived 294 foam cells (5), as well as in atherosclerosis-affected aortic tissue (18) of CAD patients.

295 CHIP in macrophages

To study the effects of CHIP mutations on gene expression in macrophages we grouped individuals carrying *TET2* and *ASXL1* mutations and compared these to age- and sex-matched non-mutation carriers (controls). Most macrophages (>80%) belonged to the M0 subtype.

299 Differential gene expression analysis of TET2-mutated macrophages

Mean age of *TET2* CHIP mutation carriers (n=3; c.6819G>T; c.6834C>T and c.7698T>C) and matched controls (n=21) showed no significant difference (60.3±12.0 vs 61.8±8.2 years). Detailed information on patient characteristics can be found in <u>Supplemental Table 3</u>. In total, 1,523 genes were differentially expressed in *TET2* mutation carriers compared to controls. 1,098 genes were upregulated and 425 genes were downregulated in CHIP mutation carriers. Top upregulated genes were *LINCO1882*, *IGKV3-15*, *IGHG2* and *IGHA1*, top downregulated genes were *BMS1P10* and *ZCCHC4* (p_{adj.}<0.05).

307 GO analysis revealed as top enriched GO terms T cell receptor complex (GO:0042101), 308 opsonization (GO:0008228) and immune response by circulating immunoglobulin 309 (GO:0002455). In general, immune system and inflammation associated pathways were 310 upregulated (**Figure 3**).

311 Weighted Gene Co-expression Network Analysis (WGCNA) was used to establish co-312 expression modules based on macrophage RNAseg data from STARNET, to identify functional 313 relations between genes, and based on genetic regulatory networks (GRN) to identify key 314 driver genes. A total of 23 modules were generated from 10,267 transcripts with module sizes 315 ranging between 36 to 2473 genes using the complete macrophage RNAseg data from 316 STARNET. The gene functions of the co-expression modules were analyzed using GO terms. 317 TET2 mutations in macrophages led to significant perturbation in the darkgreen module 318 (p<0.001), which consists of 38 genes and is primarily involved in immune system related 319 (GO:0019814, GO:0003823, GO:0006959, GO:0006958, GO:0002455, pathways

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GO:0006956, GO:0002768, GO:0002764, GO:0016064, GO:0019724; all p<0.001). Most relevant key driver genes in this module were *BACH2*, *BANK1*, *BLK*, *FCRL3*, *MS4A1* and *PAX5*. Significant associations were identified for the presence of severity and complexity of CAD based on coronary angiograms, measured by SYNTAX score (**Figure 3**).

324 Differential gene expression analysis of ASXL1-mutated macrophages

325 After matching, mean age of ASXL1 CHIP mutation carriers (n=3; c.2331C>T; c.4890A>G and 326 c.5137G>A) and controls (n=27) showed no significant difference (67.3±5.5 vs 67.3±5.6 327 years). Detailed information on patient characteristics can be found in Supplemental Table 4. 328 In macrophages of ASXL1 CHIP mutation carriers 1,222 genes were differentially expressed 329 compared to controls. 665 genes were upregulated and 557 genes were downregulated in 330 CHIP mutation carriers. Top upregulated genes were HLA-DQB2, ASNS and SLC25A16, top 331 downregulated genes were NPIPB2, HNRNPH1 and POLA2 (padi.<0.05). GO analysis revealed 332 intracellular anatomical structure (GO:0005622), RNA binding (GO:0003723) and heterocyclic 333 compound binding (GO:1901363) as top enriched terms. ASXL1 mutations led to upregulation 334 of cell cycle and metabolic process associated pathways (Figure 4).

335 ASXL1 mutations in macrophages led to significant perturbation in the black module (p<0.001), 336 which consists of 468 genes and is involved in the intracellular translation of RNA into proteins 337 (GO:0022626, GO:0006614, GO:0019083, GO:0006613, GO:0045047, GO:0006413, 338 GO:0072599, GO:0000184, GO:0019080, GO:0070972; all p<0.001). Most relevant key driver 339 genes in the black module were ANAPC16, CZIB, RPL7A, RPL14 and SNHG6. The black 340 module was significantly associated with cardiometabolic relevant traits including low-density 341 lipoprotein (LDL) and total cholesterol plasma levels, blood glucose and BMI, inflammation 342 measured by plasma C-reactive protein (CRP) levels, and with the presence and complexity 343 of coronary lesions (Figure 4).

344 Discussion

To further explore the role of CHIP mutations in CAD, we carried out large-scale, targeted deep-sequencing of genes prone to cause clonal hematopoiesis in MISSION, one of the largest postmortem biobanks focusing on cardiovascular disease. We found at least one characteristic mutation in about 46% of individuals who died with CAD at an average age of 78 years, highlighting that CHIP mutations were significantly more common in CAD patients than previously reported for subjects with unknown CAD status.^{2, 5, 27, 28}

351 In about 70% of affected individuals, the same mutation could be detected within cardiovascular tissues, either in DNA or - in case of coding variants - around one third in RNA. 352 353 Albeit the cellular composition is different in blood and various tissues, a similar percentage of 354 cells carrying CHIP mutations was found in respective samples. Exemplary visualization of two 355 different DNMT3A mutations was achieved within macrophages residing in atherosclerotic 356 human coronary and carotid arteries by in situ fluorescent staining. CHIP mutations, which are thought to promote the development and progression of ischemic heart failure,^{6, 29, 30} were also 357 358 detected in left ventricular myocardial samples of CAD patients.

359 The implications of CHIP mutations were then investigated using the STARNET datasets, focusing on CAD patients undergoing open heart surgery (average age 67 years).^{11, 31} Based 360 361 on whole-genome sequencing and RNAseg data - carried out at a lower depth than the 362 targeted deep-sequencing in MISSION - CHIP mutations were found in about 14% of CAD patients, who most likely represented higher VAFs in affected individuals. Mutations were also 363 364 detected in aortic samples affected by atherosclerosis, monocyte-derived macrophages, and 365 foam cells. This allowed us to further study the implications of CHIP mutations with respect to 366 clinical presentations and RNA expression patterns.

RNA sequencing revealed large numbers of differentially expressed genes in macrophages of
CHIP mutation carriers – as compared to patients free of these mutations. Interestingly,
patterns of gene expression also differed between those having mutations in *TET2* and *ASXL1*,
i.e. two of the most prominent CHIP mutations.

18

371 Patients carrying TET2-mutations had a higher CAD burden and – as measured by SYNTAX 372 score – more complex CAD. Macrophages generated *in vitro* by transformation of monocytes 373 from these patients revealed multiple differentially expressed genes. Enrichment analysis 374 revealed upregulation of immune system and inflammation associated pathways. Specifically, 375 TET2 mutations related to perturbation of a small atherosclerosis relevant macrophage gene 376 expression network with most relevant key driver genes being BACH2, BANK1, BLK, FCRL3, 377 MS4A1 and PAX5 mainly involved in immune response, cell migration and leukocyte 378 differentiation.

379 ASXL1 CHIP mutation carriers revealed upregulation of cardiometabolic relevant traits 380 including low-density lipoprotein (LDL) cholesterol plasma levels, inflammation measured by 381 plasma C-reactive protein (CRP) levels, and - like TET2 mutations - a higher prevalence and 382 complexity of CAD. In macrophages, ASXL1 CHIP mutations revealed differentially expressed genes, of note inflammasome related genes were upregulated. Enrichment analysis of 383 384 differentially expressed genes revealed that ASXL1 mutations related to perturbations of 385 pathways associated with cell cycle and metabolic processes. Top key drivers affected by 386 CHIP mutations were ANAPC16, CZIB, RPL7A, RPL14 and SNHG6 mainly involved in 387 regulation of metabolic processes, ubiquitination and protein synthesis.

388 Given the relevance of inflammation and cardiovascular conditions that have been associated 389 with CHIP, there appears to be an opportunity to treat selected patients with specific anti-390 inflammatory strategies,³²⁻³⁴ for example, by targeting the NLRP3 inflammasome, IL-1B or IL-6 with agents like canakinumab (monoclonal antibody against $IL-1\beta$),³⁵ anakinra (an $IL-1\beta$) 391 receptor antagonist),³⁶⁻³⁹ tocilizumab (monoclonal antibody against the IL-6 receptor),^{40, 41} 392 393 ziltevekimab (anti-IL-6 ligand monoclonal antibody),⁴² or colchicine.⁴³⁻⁴⁵ Interestingly, an 394 exploratory retrospective analysis of the CANTOS trial that studied the effects of canakinumab 395 in patients with an acute coronary syndrome suggested increased inflammatory activation and 396 more cardiovascular events, as well as specific treatment benefits in carriers of CHIP-397 mutations. However, the value of this analysis is limited as only 40% of the initial CANTOS

19

398 population was screened for CHIP mutations such that the overall number of CHIP mutation 399 carriers was low.⁴⁶ Our study supports the concept that specific CHIP mutations might identify 300 subgroups of patients with explicit alterations in gene expression in various cardiovascular 401 relevant tissues – mainly stimulating pro-inflammatory mechanisms – which might be relevant 402 in the future for directing specific treatments to these individuals.

403 Limitations

Our study has several limitations. Firstly, as we have no longitudinal data, it is unclear how 404 405 long individual CHIP mutations have been present. CHIP mutations are acquired over decades 406 and their related risks may grow over time. However, the exact time of acquisition of CHIP 407 mutations is difficult to determine and unknown in most cases. Secondly, the limited depth of 408 WGS in STARNET and the focused CHIP screening panel in MISSION may have left mutation 409 carriers undetected. Overlooking CHIP mutation carriers in STARNET may have impaired our 410 sensitivity to discriminate their related effects on clinical and transcriptional characteristics. 411 Thirdly, different DNA sequencing platforms have different levels of coverage, specificity and 412 sensitivity, making it difficult to compare results from different platforms. Standardization of 413 sequencing methods and analysis pipelines would be desirable to ensure comparability of 414 results and improve the accuracy of CHIP screening in the future. Fourth, the relevance of 415 respective mutations and the quantitative burden of VAFs need further clarification. The VAF 416 of CHIP mutations is an essential factor in determining their biological significance, but there 417 is a limited knowledge of optimal VAF 'cut-offs' for individual CHIP mutations. Yet, high VAF 418 has been associated with an increased risk of cardiovascular events. In chronic ischemic heart 419 failure (CHF), individual clone size thresholds of less than 2% in DNMT3A and TET2 have already been associated with worse outcomes.²⁹ It remains to be clarified which VAF threshold 420 421 is relevant for individual CHIP mutations and specific phenotypes, and whether these could 422 serve as novel biomarkers or support treatment decisions. Fifth, the relevance of respective 423 mutations in one or the other gene, including the additive effects of multiple mutations needs 424 further investigation. An essential key for future personalized therapy approaches will be to

validate these CHIP related outcomes in well-powered, prospective RCTs. Finally, the local
effects of individual CHIP-mutated macrophages residing within cardiovascular tissues needs
spatial investigation.

428 Conclusions

429 Our data highlight that blood derived circulating CHIP-affected leukocytes have the potential 430 to invade human atherosclerotic lesions in coronary and carotid arteries, aorta, and heart 431 muscle. We visualized CHIP-mutated leukocytes with single cell resolution in human 432 atherosclerotic plaques and staining confirmed these leukocytes as CD68⁺ macrophages. 433 Since these acquired CHIP mutations originate from hematopoietic stem or progenitor cells in 434 the bone marrow and were identified in whole blood, the visualized CHIP mutations cannot 435 originate from resident arterial macrophages. Further, RNA sequencing identified CHIP 436 specific signatures in macrophages, novel key regulators and associations with clinical traits 437 like burden and complexity of CAD (Figure 1). Future studies are needed to further 438 characterize underlying molecular mechanisms by which individual mutations contribute to 439 CVDs and whether targeting specific pathways may be valuable for precision medicine in 440 patients carrying mutations encoding for CHIP.

441 Novelty and Significance

442 What is known? (2-3 bullet points)

- CHIP represents an independent risk factor for the onset and progression of
 cardiovascular diseases and death
- 445 CHIP mutations are associated with inflammatory activation of circulating monocytes
 446 and T-cells
- Individual CHIP mutations could be important as biomarkers in the future and help
 identify high-risk patients suitable for anti-inflammatory therapy

449 What new information does this article contribute? (max. 200 words)

450 Our work provides insights on three open questions in the field. Firstly, we provide higher 451 estimates of the proportion of CAD patients affected by CHIP mutations, if these are studied 452 by focused deep-sequencing in whole blood. Next, we show that CHIP-mutated leukocytes 453 have the potential to invade human plaques and thereby contribute locally to atherosclerosis. 454 Specifically, we visualized macrophages at single cell resolution by a specific DNMT3A CHIP 455 mutations probe in coronary plaques. We also identified blood derived CHIP mutations in 456 human coronary and carotid arteries and heart muscle on DNA level. Additionally, we describe 457 previously unknown key-regulatory genes and pro-atherosclerotic alterations at the RNA level 458 of CHIP mutated macrophages. Importantly, different CHIP mutations appear to affect different 459 pathways, networks and modules, which nevertheless all have relevance for CAD progression. 460 These novel results (Figure 1) appear to be of relevance for future personalized medicine 461 approaches specifically designed for CHIP mutation carriers.

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- Table 1 deep-DNAseq identifies CHIP mutations in atherosclerotic plaques and left
 ventricular myocardium
- 695
- 696 Figures
- 697 **Figure 1** Central illustration highlighting most relevant novel findings
- 698 **Figure 2 –** mutaFISH[™] visualizes CHIP-mutated leukocytes in human plaques
- **Figure 3** RNAseq of macrophages (TET2-CHIP vs non mutation carriers)
- **Figure 4** RNAseq of macrophages (ASXL1-CHIP vs non mutation carriers)
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- 702 Supplement
- **Supplemental Table 1** List of CHIP mutations in MISSION
- 704 Supplemental Table 2 List of CHIP mutations in STARNET
- **Supplemental Table 3** STARNET patient characteristics TET2 macrophages
- 706 **Supplemental Table 4** STARNET patient characteristics ASXL1 macrophages
- 707 Supplemental Figure 1 VAF and distribution of CHIP mutations in MISSION
- **Supplemental Figure 2** Deep-DNAseq identifies CHIP mutations in atherosclerotic
- coronary and carotid samples, and left ventricular myocardium
- 710 **Supplemental Figure 3** Overview plaque of interest different stainings
- 711 Supplemental Figure 4 Visualization of CD68⁺ CHIP mutated macrophage
- 712 **Supplemental Figure 5** DNMT3A CHIP mutation (c.2245C>T) in human atherosclerotic
- 713 plaque
- 714 **Protocol** adapted mutaFISH[™] protocol

Table 1 – This study provides evidence that CHIP-mutated leukocytes have the potential to invade human atherosclerotic plaques in coronary and carotid arteries, and heart muscle from peripheral blood. Out of 25 unique CHIP mutations (identified in whole blood), 18 mutations (shown) were identified in at least one corresponding tissue of interest. Tissue sequencing of CHIP mutation carriers revealed that identical CHIP mutations were identified in the corresponding coronary artery (n=13), carotid artery (n=10) and left ventricular heart muscle (n=4) (right). Provided are mutations on DNA level and variant allele frequency (VAF) in %.

CHIP-affected gene	Whole Blood	Coronary	Carotid	Heart Muscle
(mutation)	(VAF in %)	(VAF in %)	(VAF in %)	(VAF in %)
ASXL1 (c.1772dup)	5.2	1.2	0	0
CBL (c.1211G>A)	9.1	2.2	0	0
DNMT3A (c.1628G>C)	21.6	0	5.4	0
DNMT3A (c.976C>T)	20.5	0	2.4	0
DNMT3A (c.2333T>G)	6.5	2.5	0	0
DNMT3A (c.2245C>T)	5.6	1.5	0	1.5
DNMT3A (c.1726_1729delinsC)	22.6	5.9	5.8	0
DNMT3A (c.1969G>A)	5.3	1.0	1.1	0
DNMT3A (c.2204A>G)	11.3	0	2.5	0
DNMT3A (c.2104G>T)	11.8	1.4	2.7	0
PPM1D (c.1535del)	0.7	0	2.0	0
PPM1D (c.1535del)	0.9	1.8	0	0
SMC3 (c.3598G>A)	6.0	1.1	0	1.0
TET2 (c.2839C>T)	19.2	4.0	5.1	0
TET2 (c.4193T>G)	6.4	2.1	2.1	0
TET2 (c.1219del)	27.7	4.4	0	2.0
TET2 (c.4546C>T)	29.7	5.1	0	2.6
TET2 (c.5454_5458del)	9.8	0	2.1	0



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723 Figure 1. Central illustration - important novel findings from this study. Left panel: Over 300 CHIP 724 mutation carriers from the Munich cardlovaScular Studles biObaNk (MISSION) and the Stockholm-Tartu 725 Atherosclerosis Reverse Networks Engineering Task (STARNET) studies were evaluated. Upper 726 panel: In our study, we confirmed blood derived CHIP mutations in human atherosclerotic plaques of 727 coronary artery, carotids and heart muscle on DNA level. Middle panel: For the first time we were able 728 to visualize macrophages with specific DNMT3A CHIP mutations using mutaFISH[™] at single cell 729 resolution in human atherosclerotic plaques. Enrichment of CHIP mutated cells in human plaques was 730 confirmed. Lower panel: Previously unknown pro-atherosclerotic alterations in gene expression of 731 CHIP mutated macrophages at the level of regulatory key-drivers, pathways, networks, and modules 732 with relevance for CAD progression were identified. ASXL1: ASXL Transcriptional Regulator 1; CAD: 733 Coronar artery disease; CHIP: Clonal hematopoiesis of indeterminate potential; DNMT3A: DNA 734 Methyltransferase 3 Alpha; HSC: hematopoietic stem cell; mutaFISH: mutation-specific Fluorescence 735 In Situ Hybridization; TET2: Tet Methylcytosine Dioxygenase 2.



Figure 2 – CHIP-mutated cells have the potential to invade from the peripheral blood into human atherosclerotic lesions. mutaFISH[™] allowed detection of single nucleotide exchanges at the RNA level in single cells. Staining for a specific DNMT3A mutation (mut) and wild type (wt) at the RNA level was performed *in situ* in advanced atherosclerotic plaques of human FFPE coronary tissue. Left panel: merged overview of an advanced atherosclerotic plaque. Red boxes highlight areas of interest enlarged in the following panels. Middle panel: CHIP-affected leukocytes were identified in the inflammatory shoulder regions of human atherosclerotic plaque (white arrow). Right panel: The DNMTA3 mutation c.2333G>T was detected on single cell resolution via the green signal, the DNMT3A wild type via the red signal and the cell nuclei (DAPI) via the blue signal. DAPI: 4',6-Diamidin-2-phenylindole; EEL: external elastic lamina; FFPE: formalin-fixed paraffin embedded;
 IEL: internal elastic lamina; LU: lumen; mutaFISH: mutation-specific Fluorescence In Situ Hybridization.



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745 Figure 3 – Differentially expressed genes in TET2 CHIP mutation carriers (n=3) versus age and sex matched non-mutation controls (n=21) were enriched in 746 darkgreen module in STARNET macrophage RNAseg data. Left upper panel: Volcano plot of differentially expressed genes between TET2 CHIP mutation carriers 747 versus age and sex matched non-mutation controls in STARNET CAD cases. Differentially expressed genes were highlighted in lightblue. Top upregulated and downregulated genes with the smallest p-values or with the biggest log2 fold changes were labeled with gene names. Differentially expressed genes that overlap 748 749 with darkgreen module genes were highlighted in darkgreen. Left bottom panel: Top 10 enriched gene ontologies for differentially expressed genes in TET2 CHIP 750 mutation carriers versus non-mutation controls. Bonferroni corrected p<0.05 was considered statistically significant. Right upper panel: Visualization of darkgreen 751 module inferred from STARNET macrophage RNAseq data. Top key drivers were highlighted in yellowgreen. Right bottom panel: Dot plot indicating the 752 association of darkgreen module genes with clinical traits. P-value <0.05 (-log10(p) >1.3, cut off was indicated by vertical red line) is considered statistically 753 significant.GO: Gene Ontology; BP: biological pathway; CC: cellular component; MF: molecular function.



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755 Figure 4 – Differentially expressed genes in ASXL1 CHIP mutation carriers (n=3) versus age and sex matched non-mutation controls (n=27) were enriched in 756 black module in STARNET macrophage RNAseq data. Left upper panel: Volcano plot of differentially expressed genes (DEGs) between ASXL1 CHIP mutation 757 carriers versus age and sex matched non-mutation controls in STARNET CAD cases. Differentially expressed genes were highlighted in pink. Top upregulated and 758 downregulated genes with the smallest p-values or with the biggest log2 fold changes were labeled with gene names. Differentially expressed genes that overlap 759 with black module genes were highlighted in black. Left bottom panel: Top 10 enriched gene ontology (GO) terms for differentially expressed genes in ASXL1 760 CHIP mutation carriers versus non-mutation controls. Bonferroni corrected p<0.05 was considered statistically significant. Right upper panel: Visualization of black 761 module inferred from STARNET macrophage RNAseg data. Top key drivers were highlighted in pink. Right bottom panel: Dot plot for the association of black 762 module genes with clinical traits. P-value <0.05 (-log10(p) >1.3, cut off was indicated by vertical red line) is considered statistically significant. GO: Gene Ontology; 763 BP: biological pathway; CC: cellular component; MF: molecular function.