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Saliva‑derived DNA is suitable OPEN for the detection of clonal haematopoiesis of indeterminate potential

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Clonal haematopoiesis of indeterminate potential (CHIP) has been associated with many adverse health outcomes. However, further research is required to understand the critical genes and pathways relevant to CHIP subtypes, evaluate how CHIP clones evolve with time, and further advance functional characterisation and therapeutic studies. Large epidemiological studies are well placed to address these questions but often collect saliva rather than blood from participants. Paired saliva- and blood-derived DNA samples from 94 study participants were sequenced using a targeted CHIP-gene panel. The ten genes most frequently identifed to carry CHIP-associated variants were analysed. Fourteen unique variants associated with CHIP, ten in *DNMT3A***, two in** *TP53* **and two in** *TET2***, were identifed with a variant allele fraction (VAF) between 0.02 and 0.2 and variant depth≥ 5 reads. Eleven of these CHIP-associated variants were detected in both the blood- and saliva-derived DNA sample. Three variants were detected in blood with a VAF> 0.02 but fell below this threshold in the paired saliva sample (VAF 0.008—0.013). Saliva-derived DNA is suitable for detecting CHIP-associated variants. Saliva can ofer a cost-efective biospecimen that could both advance CHIP research and facilitate clinical translation into settings such as risk prediction, precision prevention, and treatment monitoring.**

Keywords Clonal haematopoiesis, CHIP, Somatic mutations, Next generation sequencing, Saliva, Blood

Age-related clonal haematopoiesis of indeterminate potential (CHIP), usually observed as somatic mosaicism in blood-derived DNA, has been associated with many adverse health outcomes including haematological con-ditions, cardiovascular disease (CVD), and all-cause mortality^{[1](#page-5-0)}. CHIP is characterised as haematopoietic cells of peripheral blood with at least one driver mutation, and without haematological malignancy or detectable morphological evidence of dysplasia^{[2,](#page-5-1)[3](#page-5-2)}. Haematopoietic stem cells and progenitor cells with mutations that confer a ftness advantage will proliferate in clonal expansion, and the accumulation of these mutations can result in disease^{1,[2](#page-5-1)}.

Research deciphering the molecular and associated clinical features of CHIP has gained considerable momentum via the analysis of large human data sets available from research initiatives such as the UK biobank and All of Us^{[4](#page-5-3)}. These studies have refined both our understanding of CHIP and the bioinformatic approaches required to identify CHIP in a range of genomic datasets including whole genome, whole exome, and targeted gene panel sequencing data. These studies have revealed CHIP to have diverse molecular phenotypes (somatic mutationdriven subtypes), that are associated with a spectrum of germline genetic causes and clinical features⁵.

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Recently, population-scale genomic datasets have enabled further interrogation of the complexities of CHIP and the identifcation of important diferential associations between disease susceptibility and the clone-specifc gene mutation. For instance, *DNMT3A* mutations are not associated with CVD but have been shown to be associated with an increased risk of solid tumours. Kessler et al., further described common genetic variation associated with CHIP[5](#page-5-4) . For example, common germline variants at the *CD164* gene regions were associated with decreased risk of *DNMT3A* CHIP, whereas germline variants in *TCL1A* were associated with increased risk of *DNMT3A* CHIP.

More research is required to understand the critical genes and pathways relevant to each CHIP subtype, evaluate how CHIP clones change with time, and further advance functional and therapeutic studies. Population-scale genomic studies rarely involve serial blood sampling of participants and are thus not well placed to address some of these emerging questions in CHIP research. In contrast, large-scale epidemiological studies of human health often take serial biological samples from participants over long periods of time (often decades). These studies can therefore be well positioned to address some of these gaps in CHIP knowledge.

In this context, saliva is ofen collected as a source of germline DNA from research participants because it can be collected non-invasively at home and shipped at room temperatures at lower cost with no time sensitivities for downstream biobanking (e.g., processing and freezing). Several pieces of evidence suggest that DNA extracted from saliva may be a suitable template for CHIP analysis. First, white blood cells are known to cross the mucosal barrier and have been suggested to make up approximately 75% of the nucleated cells in a saliva specimen 6 . Second, DNA derived from mouthwashes afer allogeneic blood stem cell transplantation have been shown to display chimeric or complete donor genotype supporting a considerable blood-DNA contribution^{[6,](#page-6-0)[7](#page-6-1)}. Third, saliva-derived DNA has been successfully used in targeted gene panel sequencing. Fourth, Soyfer et al., (2024), assessed saliva for haematopoietic cells and were able to successfully quantify somatic variants in families with myeloproliferative neoplas[m8](#page-6-2) . However, there are likely considerable saliva-specifc technical and bioinformatic challenges that will need to be overcome to diferentiate germline and CHIP-associated genetic variation especially in the context of a potential reduction in CHIP-associated variant allele fraction (VAF) (if the contribution of blood-cell nuclei to the DNA yield is not high in saliva samples). If it can be demonstrated to be a suitable template for CHIP analysis, saliva-derived DNA ofers a cost efective, practical alternative biospecimen that could be utilised to both advance research and be a companion to clinical translation into settings such as risk prediction, precision prevention, and treatment monitoring.

Tis study sought to assess the suitability of saliva-derived DNA in the detection of CHIP associated variants using a custom targeted gene panel (focusing on the 10 genes most frequently detected to carry CHIP-associated variants), a massively parallel sequencing approach, and saliva- and blood-derived DNA samples from 94 cohort study participants.

Results

Library preparation and sequencing

Paired blood and saliva samples were obtained from 94 healthy participants of the Australian Breakthrough Cancer cohort (Table [1](#page-1-0)) and DNA was extracted from all samples. A total of 192 samples successfully underwent library preparation. Tis included 188 test samples (94 blood-derived DNA and 94 saliva-derived DNA pairs), two commercial controls, and two in-house high molecular weight (HMW) controls. Quality metrics of all sequenced samples showed a median read duplication rate of 54.2% and, following deduplication, a median of-target base rate of 20.8%. Of the 188 test samples, 33 samples (17.6%) did not reach≥80% target coverage at 500×depth; 32 of these 33 samples were saliva-derived DNA, with one blood-derived DNA sample (Table [2\)](#page-2-0). Nine of 188 test samples (5%) did not reach > 50% target coverage at 500 × depth; 8 of these 9 samples were saliva-derived DNA and 1 was a blood-derived DNA sample (Table [2\)](#page-2-0). These 9 correspond to samples that, following enzymatic fragmentation, had poor pre-capture DNA library profles (long fragment sizes, a plateau peak and/ or low concentrations).

Table 1. A demographic representation of the 94 participants selected from the Australian Breakthrough Cancer cohort.

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Table 2. Sequencing alignment metrics of deduplicated reads for 188 samples and 4 controls.

Controls

Variants that were included in the myeloid control, and in the 10 genes assessed, were called down to a VAF of 0.01 (Supplementary Table 1). Sequencing metrics for both our in-house HMW and commercial controls met the > 80% target coverage at $500 \times$ depth criteria (Table [2](#page-2-0)).

Variants identifed with VAFs between 0.02 and 0.2

In our cohort of healthy participants between the age of 64–75 (Table [1\)](#page-1-0), twenty-one variants (VAF 0.02–0.20) were identified in 18 participants. Thirteen were detected in both blood and saliva-derived DNA pairs. Six variants appeared to be present only in blood-derived DNA, within the VAF thresholds, while two were detected only in saliva-derived DNA (Supplementary Table 2). Upon further investigation, fve of these six variants found only in the blood-derived DNA were found below the 0.02 threshold in the saliva DNA pair (ranging between 0.007 - 0.019). The two variants observed in one saliva-derived DNA sample were not detected in the bloodderived DNA pair.

Only one artifact was identifed (NM_004972.4:c.1777-7del**)** in 30/188 samples (15.9%), 14 in blood & 16 in saliva-derived DNAs (VAF \sim 0.03). This artifact was removed. No artifacts were observed in the manual inspection of CHIP associated variants in IGV.

Variants associated with CHIP

Fourteen of the twenty-one variants (VAF 0.02–0.20) were found to be associated with CHIP (Table [3\)](#page-2-1). Ten variants were identifed in *DNMT3A*; two variants in *TP53*; and two variants in *TET2*. No putative CHIP-associated variants were identifed in the other seven genes assessed. Eleven of fourteen (79%) CHIP associated variants were found in both the blood and saliva-derived DNA pairs when applying the VAF 0.02—0.20 and variant depth

Table 3. Fourteen CHIP-associated genetic variants identifed in 94 paired saliva and blood-derived DNA samples. Three variants fell below the VAF 0.02 threshold as indicated in bold. *Upon visual reassessment of the genomic alignment the variant nomenclature was adjusted.

(VD)≥5 read thresholds. For a given variant, the VAFs were very similar between the blood and saliva-derived DNA pairs with a largest difference of \sim [3](#page-2-1)% (Table 3). Three of the fourteen (21%) CHIP associated variants were found in only the blood-derived DNA samples using the thresholds of VD≥5 and VAF 0.02–0.20 (Table[3;](#page-2-1) Fig. [1](#page-3-0)). However, they were detected in their paired saliva-derived DNA with a VD≥5 and VAFs 0.008 – 0.013 (Table [3](#page-2-1)).

Discussion

Our study demonstrates high concordance between CHIP-associated variants called in pairs of DNAs sourced from blood and saliva, illustrating the suitability of saliva-derived DNA for the detection of CHIP.

This study focused on the analysis of 10 genes that have been reported in large studies to be the most frequently involved in CHIP-associated somatic mutation⁴. Vlasschaert et al., examined the distribution of genes carrying CHIP variants in 19,921 individuals and found that these ten genes carried the most CHIP-associated variants. Consistent with this, and other literature^{[4,](#page-5-3)[9](#page-6-3)–11}, our small study only identified variants in *DNMT3A*, *TP53,* and *TET2,* with DNMT3A being the most mutated gene*.*

Prior to this study, there was some evidence to support saliva-derived DNA being a suitable biological resource for detecting somatic mutations in clonal haematopoiesis and other haematologic malignancies. Soyfer et al. recently presented data that examined the feasibility of using DNA prepared from saliva specimens to measure somatic variation at low VAFs $(\leq 0.1)^8$. However, challenges were still anticipated relating to the poorer quality of saliva-derived DNA and the proportion of blood cell nuclei represented in the DNA yield. Indeed, eight of nine DNA samples that did not meet the quality metric threshold of 50% coverage at 500X were from saliva and corresponded to pre-capture libraries with poor TapeStation profles and/or low concentrations afer pre-capture PCR. However, vast majority of saliva-derived DNA samples performed very well and had similar metrics to their paired blood-derived DNA sample.

Figure 1. A graphic representation of our bioinformatic workflow used in this study to identify somatic variants (VAFs 0.02-0.2) in blood and saliva-derived DNA pairs. Three CHIP-associated variants detect in blood only, indicated by *, were detected in the saliva-derived DNA pair afer exploring below the VAF threshold 0.02 (ranging between 0.008—0.013).

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When considering all variants identifed with VAFs between 0.02 and 0.20, six variants were identifed in blood-derived DNA, but not in the corresponding saliva-derived DNA pair, for six individuals. Five of these variants were found below the 0.02 threshold in saliva-derived DNA while one variant was not detected in saliva. Three of these five variants were identified as CHIP-associated variants (Table [3](#page-2-1)). There were two variants detected in saliva that were not detected in the paired blood samples (Supplementary Table 2). Interestingly, these were from the same individual, a woman with a prior history of smoking but who had ceased smoking 40 years before providing these samples. It is possible given their absence in blood, that these two variants could be derived from mucosal epithelia $^{\rm 8}$. Further development of methodologies aimed at reducing the epithelial content of saliva, such as that described by Soyfer et al. (2024), could help to refne a saliva derived based assay for CHIP.

When considering all CHIP-associated variants with VAFs between 0.02 and 0.20, eleven of the fourteen variants were detected in both the blood and saliva-derived DNA pairs with these thresholds. The VAFs of these variants in blood and saliva were similar between pairs and there was no suggestion that the VAF measured in the saliva-derived DNA was consistently reduced compared to blood—consistent with the DNA being predominantly from blood cell nuclei. There was no identifiable technical reason why three CHIP associated variants identified in diferent saliva-derived DNA samples had lower VAFs (between 0.008—0.013). TapeStation profles were consistent with other well performing saliva-derived DNA samples, and all three of these saliva-derived DNA samples had at least 50% coverage at 500x (one had as high as 88% target coverage at 500x). The time between sampling of the three saliva and blood sample pairs ranged between 2 months and 34 months. However, given that CHIP progression seems to be ~ 0.5 –1.0% per year^{[2](#page-5-1)}, it is unlikely CHIP clones evolved enough during this time between biological sampling to refect observed changes in CHIP clone frequency in these VAF.

The small number of artifacts found in this study is likely a result of a combination of the small sample size; assessing only ten specifc genes, none of which present technical sequencing challenges; and deep sequencing (average 1196x).

This study has a number of strengths: The Horizon's myeloid control was diluted with a wildtype reference to provide confdence that variants would be called if present in the samples. All variants that were in this control, and in the assessed 10 genes, were successfully called afer applying our pipeline and fltering methods. The participants included in this work were 64-75 years old, given the age relatedness of CHIP, the number of CHIP-associated variants in this group was anticipated to be $\sim 10-15\%$ ^{11[,12](#page-6-5)}, which was consistent with our results. Variants were detected below the VAF threshold of 0.02 in saliva samples, indicating this method could be applied to variants present below this frequency. There is some evidence that supports clinical relevance for detecting CHIP-associated variants below the standard 2% threshold¹³⁻¹⁵. A limitation of this study due to the technical design, is that the study does not capture large chromosomal alterations and thus cannot detect mosaic chromosomal alterations.

Conclusion

Tis study has demonstrated that saliva-derived DNA is a suitable template for CHIP analysis. Saliva-derived DNA offers a cost effective, practical alternative biospecimen that could be utilised to both advance research and be a companion to clinical translation into settings such as risk prediction, precision prevention and treatment monitoring.

Methods

Ethical statement

The Australian Breakthrough Cancer Study is approved by the Cancer Council Victoria Human Ethics Review Committee (#1403). The conduct of our study is consistent with The National Health and Medical Research Council of Australia's National Statement on ethical conduct in human research and performed in accordance with the Declaration of Helsinki. Written informed consent was obtained from all participants.

Source material

Paired saliva and blood samples were collected from 94 participants aged 64–75 years at enrolment into the Australian Breakthrough Cancer Study, a prospective cohort of over 56,000 Australians aged 40–74 and unaffected by cancer when recruited in 2014–18. Study participants were provided an at-home saliva collection kit, Oragene OG-500 (DNAGenotek), and returned the sample to Biobanking Victoria via a postal service. Blood samples were collected in EDTA tubes at local pathology services and processed centrally within 72 h of blood draw. Duration between collection of paired saliva and blood samples ranged from 2 to 34 months.

Reference standards were utilised including 100% wildtype (Catalogue ID: HD752) and a myeloid DNA reference standard (Catalogue ID: HD829) (Horizon Discovery, UK) to identify if this platform could detect variants at a VAF of at least 0.01. Tis control mix was included in each of the two 96 well plates.

DNA extraction

DNA was extracted from paired whole blood and saliva samples using either a Qiagen Symphony or Chemagic™ platform following manufacturers protocols (Qiagen, Valencia, CA; PerkinElmer, Waltham, MA, United States).

Sequencing panel design

The panel design consisted of 39 genes and covered 57.111 kbp. This study considered ten specific genes and gene regions (~28,805 kbp of the design) that where most likely to contain somatic variants associated with CHIP: *DNMT3A*, *TET2*, *ASXL1*, *JAK2*, *GNB1*, *PPM1D*, *TP53*, *NF1*, *SRSF2*, *SF3B1*[1](#page-5-0),[4,](#page-5-3)[9,](#page-6-3)[16.](#page-6-8)

Library preparation and sequencing

Agilent's SureSelect XT HS2 DNA System was utilised using the automated Agilent NGS Workstation Option B (SureSelect; Agilent Technologies, Santa Clara, CA, USA). Input genomic DNA was 200 ng for both blood and saliva-derived DNA samples and 100 ng for the prepared horizon control. DNA enzymatic fragmentation and library preparation followed the SureSelect protocol with minor modifcation including extension of the fragmentation incubation time from 25 to 30 min to accommodate the target size of 2×75 bp. Pre-capture PCR conditions involved 8 cycles with unique dual-indexed primers, and sample libraries were assessed on Agilent's 4200 TapeStation system using a D1000 ScreenTape. Libraries with poor profles or low concentrations were noted but not excluded from sequencing to understand the impact that poor libraries had on variant calling between the source materials. Multiplex hybridisation (16x) and capture method for enrichment of targeted genes was applied before sequencing on NextSeq 550 using Illumina's high output kit v2.5 (150 CYS) with the aim of reaching 80% coverage of target region at 500X. Sequencing methods followed Illumina's NextSeq System: Denature and Dilute Libraries Guide^{[17](#page-6-9)}.

Bioinformatic pipeline for variant calling

Bioinformatic pipelines (Fig. [1\)](#page-3-0) were written in Nextfow (v23.10.1)[18](#page-6-10) [\(https://github.com/Prec-Med/bldsal-analy](https://github.com/Prec-Med/bldsal-analysis/tree/main) [sis/tree/main\)](https://github.com/Prec-Med/bldsal-analysis/tree/main) and executed on the 'The Multi-modal Australian ScienceS Imaging and Visualisation Environment (MASSIVE) high performance computing infrastructure' established by Monash University and partners[19](#page-6-11).

Raw sequence data conversion from bcl files to fastq used illumina's bcl2fastq (v2.20) to achieve this. Sure-Select adapters were trimmed with Agilent's AGeNT tools v3.0.6 trimmer (Agilent Technologies, Santa Clara, CA, USA), before alignment to human genome reference build GRCh38 using BWA-MEM v0.7.17²⁰. Unique Molecular Index (UMI) deduplication was performed with Agilent's AGeNT CReaK in hybrid mode (Agilent Technologies, Santa Clara, CA, USA). Metrics for Fastqs and BAMs were generated with FastQC (v 012.1)²¹ and Genome Analysis Toolkit (GATK v4.4.0.0)^{[22](#page-6-14)} before aggregating using MultQC (v1.18)²³.

VarDict-java (v1.8.3)²⁴ was used to call somatic variants as the caller can be used to call single nucleotide variants, multi-nucleotide variants, insertions/deletions, complex, and even structural variants^{13[,24](#page-6-16)[,25](#page-6-17)}. However, this study focused specifcally on insertions/deletions and single nucleotide variants. Variant calling thresholds were set at a VAF ≥0.005 before applying secondary thresholds later in the pipeline. Indel normalisation and multiallelic site decomposition, along with general VCF file manipulation, was conducted using bcftools (v1.18)^{[26](#page-6-18)} before annotating with Ensembl-VEP v111^{[27](#page-6-19)}. Variants were then filtered with slivar (v0.3.0)^{[28](#page-6-20)} using a threshold requiring a minimum of 5 reads per variant, and VAF between 0.02—0.20 (2—20%).

Agreement between variants called in the paired blood-saliva samples was evaluated using Starfsh ([https://](https://github.com/dancooke/starfish) [github.com/dancooke/starfish\)](https://github.com/dancooke/starfish) which uses Real Time Genomics (RTG[\)29](#page-6-21) engine for VCF intersections. Blood/ saliva VCF pairing, parallel execution of intersections, and aggregation of variant statistics from intersected VCFs (Supplementary Material) were performed in Python using pysam [\(https://github.com/pysam-developers/](https://github.com/pysam-developers/pysam).) [pysam\).](https://github.com/pysam-developers/pysam).)[26](#page-6-18) Sequence artifacts were identifed and removed by applying a threshold of variant detected in greater than 10% of samples, other studies have used similar cut-offs $(6%)^{13}$ $(6%)^{13}$ $(6%)^{13}$.

Variant fltering and identifying putative CHIP variants

Only variants identifed in the genetic regions reported by Vlasschaert, et al. were assessed excluding premature truncating variants 3' to the last 50 bases of the penultimate exon—to distinguish bona fde CHIP variants from somatic variants that have not been previously associated with clonal expansion of haematopoietic stem cells⁴.

Read alignment and quality for all variants were manually inspected using Interactive Genomics Viewer (IGV, Broad Institute, MA) to confirm sufficient read depth and allele balance. Variants were also inspected to make sure they were not i) in regions of low genomic complexity (i.e. homopolymer regions), ii) in regions with multiple misaligned reads, iii) in regions with multiple nearby non-reference or poor-quality base calls, or iv) in regions with exon–intron boundary soft clipping. Any variants suspected to be sequencing or mapping artifacts were fagged. Variants that were not identifed in both samples were investigated to identify if this was because the VAF fell outside of the 0.02—0.2 cut-of or if the VD was less than 5.

Data availability

Data presented in this report can be requested via PEDIGREE. [https://www.cancervic.org.au/research/epide](https://www.cancervic.org.au/research/epidemiology/pedigree) [miology/pedigree](https://www.cancervic.org.au/research/epidemiology/pedigree).

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Author contributions

R.L.O., J.B., P.H., M.C.S., P.Y., K.H., conceptualised and drafed the manuscript; developed the study design's logistics; generated, analysed, and interpreted the data. R.L.O., A.R. conducted the lab work. H.T. managed the biological material and collection. M.C.S., S.J.N., K.J.B., G.G.G., R.L.M. provided grant funding and conceptualised the study design. All authors contributed substantially to manuscript preparation. All authors approved the fnal version.

Competing interests

The authors declare no competing interests.

Additional information

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