Nanopore sequencing of the pharmacogene CYP2D6 allows simultaneous haplotyping and detection of duplications

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Abstract

Background: The accurate genotyping of *CYP2D6* is hindered by the very polymorphic nature of the gene, high homology with its pseudogene *CYP2D7*, and the occurrence of structural variations. Long read sequencing offers the promise of overcoming some of these challenges, along with the advantage of straightforward variant phasing. We have established methods for sequencing and analysis of DNA amplicons containing the whole *CYP2D6* gene, using the GridION nanopore sequencer. **Materials and methods:** Seven reference and 25 clinical samples covering various haplotypes including gene duplication were barcoded and sequenced over two sequencing runs. Sequenced raw reads were analyzed using a pipeline of bioinformatics tools including two mapping tools and two variant calling tools. **Results:** Using minimap2 and nanopolish (mapping and variant calling tools respectively) resulted in the most accurate variant detection. Haplotypes of all samples could be detected accurately to the subvariant level in most samples, while the remaining samples had either novel variants or variant patterns not matched to the current PharmVar *CYP2D6* haplotype database. Allele duplication could also be determined by analyzing the allelic balance between the sample haplotypes. **Conclusion:** Nanopore sequencing of *CYP2D6* offers a high throughput method for genotyping, accurate haplotyping, and detection of new variants and duplicated alleles.

1 Introduction

CYP2D6 is one of the most important and widely studied genes in pharmacogenetics. It codes for the cytochrome P450 2D6 enzyme which is responsible for the metabolism or bioactivation of ~25% of all available drugs, including antidepressants such as selective serotonin reuptake inhibitors (SSRIs), analgesics such as codeine, and anti-cancer drugs such as tamoxifen (1). *CYP2D6* is also one of the most polymorphic human genes, leading to considerable variability in enzyme activity between individuals with the need for accurate genotype information for clinical purposes (2).

CYP2D6 is a relatively small gene (4.4 kilobases from start to stop codon) located on the long arm of chromosome 22. However, the complexities of this gene make accurate genotyping challenging (3-5). The first challenge lies in the number of variants in the gene. PharmVar (https://www.pharmvar.org/gene/CYP2D6) has compiled more than 100 allelic variations and more than 200 genetic variants (6) in this gene. Moreover, the GnomAD database of more than 140K individuals suggests there may be more than 1000 variants in this gene, including 374 missense and 28 loss-of-function variants (7).

In addition to its polymorphic sequence, *CYP2D6* can be affected by structural variations including gene deletion, gene duplication, hybrid gene conversion or tandem arrangement with its upstream pseudogene, *CYP2D7*. Since *CYP2D6* and *CYP2D7* share more than 90% sequence similarity and occur in tandem on the chromosome, care must be taken to selectively target CYP2D6 to obtain accurate genotype information for clinical utility (8, 9).

Various methods have been developed to genotype *CYP2D6,* from the basic restriction fragment length polymorphism to the more sophisticated real time polymerase chain reaction (PCR), microarray, mass spectrometry, or next generation sequencing (10-12). Most methods are limited by the ability to detect only a subset of pre-selected variants. While next generation sequencing (NGS) methods have the ability to screen all *CYP2D6* variants, these methods are hampered by the risk of misalignment of *CYP2D6* and *CYP2D7* due to the short-reads generated. Most of these methods also do not provide information for variant phasing to confidently determine haplotypes. In practice, this is often carried out using allele specific primers to isolate one or both alleles, followed by Sanger sequencing of the amplification products (13). This is labour intensive, requires a greater investment of time, and can be technically demanding.

Long read sequencing is envisaged to resolve challenges faced by previous short read technology. For *CYP2D6* genotyping, long amplicon sequencing not only permits unequivocal variant detection without interference from the homologous pseudogene, it also means that variant phasing can be carried out in a reliable and straightforward fashion. A preliminary report

described *CYP2D6* sequencing of a single sample using the Oxford Nanopore Technologies (ONT)

MinION with an earlier, more error-prone version of the technology (14). In this paper, we

explore the application of current ONT long read sequencing chemistry to simultaneously analyze

CYP2D6 from multiple reference and clinical samples. We performed the sequencing on the

GridION platform, a compact nanopore-based instrument from ONT (Oxford, UK) which enables

sequencing and data computation in the same module in a real time manner.

Materials and Methods

Samples

Thirty-two samples were genotyped over two sequencing runs, with 12 samples in the first and

24 samples in the second run. Four samples from the first run were repeated in the second run as

control samples. Seven *CYP2D6* genotyped samples (15) were obtained from Coriell Institute

(Camden, NJ, USA) and 25 unrelated clinical samples were collected from two adverse drug

reaction cohorts established in our laboratory, Understanding Adverse Drug Reactions Using

Genomic Sequencing (UDRUGS) and Genetics of Antidepressants study (GO-A) (16). These studies

received ethical approval respectively from Southern Health and Disability Ethics Committee

(URA/11/11/065) and Northern B Health and Disability Ethics Committee (18/NT/21), Ministry

of Health, New Zealand. The clinical samples consisted of 14 blood samples and 11 saliva samples.

DNA from blood samples was extracted using a modified salting-out method (17) followed by a

phenol-chloroform purification step (Supplementary File 1). Saliva samples were collected via an

Oragene DNA (OG-500) kit (DNA Genotek Inc., ON, Canada) and DNA was extracted according to

the manufacturer's protocol.

CYP2D6 Long PCR

The 6.6 kilobases (kb) long PCR amplifying the whole *CYP2D6* gene including upstream and

downstream non-coding regions was performed according to Gaedigk, 2007 (18). Specific

sequences from ONT were added to the 5' end of forward and reverse primers to enable sample

barcoding in subsequent steps. 250 ng of genomic DNA was amplified in the presence of 1x Kapa

LongRange Buffer, 0.3 mM dNTPs, 1.75 mM $MgCl_2$, 0.7 μM of each primer, 1 M of betaine, and 1.25

units of Kapa LongRange Taq Polymerase (Sigma-Aldrich) in a 50 μL reaction. PCR was run as

follows: 94°C for 3 minutes, 30 cycles of 94°C for 25 seconds, 68°C for 10 seconds, 68°C for 7

minutes, and a final extension at 68°C for 7 minutes.

Deletion and multiplication of the *CYP2D6* gene can be identified by amplifying a 3.5 kb fragment

with CYP-13 and CYP-24 primers (19) for deletion and Frag B primers (18) for duplication in a

duplex PCR together with the 6.6kb primers. This PCR was carried out as above using 0.4 μM of

the 6.6 kb primers and 0.3 μM of the deletion or duplication primers.

In samples where a gene duplication was detected, the duplicated allele was amplified with tailed

FragD primers (18) which produced 8.6 kb fragments, and these were subsequently barcoded

and sequenced on the GridION. This primer set recognizes the REP-DUP region, a unique

combination of *CYP2D6* and *CYP2D7* downstream regions commonly found in duplications of the

CYP2D6 gene. This PCR was similar to that for *CYP2D6* described above, except 0.4 μM primers

and extension for 10 minutes instead of 7 minutes were used. The sequences of all primers used

in this study are listed in Supplementary Table 1.

Barcoding PCR

Specific barcodes were assigned to the 6.6 kb PCR products of each sample and 8.6 kb PCR

products (where applicable) using the PCR Barcoding Expansion 1-96 kit (EXP-PBC096) (ONT).

Barcodes were added using a second-round PCR to 0.5 nM of CYP2D6 6.6 kb or 8.6 kb purified

PCR product in the presence of 1x LongAMP PCR buffer, 2 mM of $MgCl_2$, 0.3 mM of dNTPs, and 5

units of LongAmp Taq DNA polymerase in 50 μL reaction. PCR was performed as follows: 95°C

for 3 minutes, 15 cycles of 95°C for 15 secs, 62°C for 15 seconds, 65°C for 7 minutes (6.6 kb

products) or 10 minutes (8.6 kb products), with a final extension of 65°C for 7 minutes or 10

minutes.

Modified Beads Purification

Both initial and barcoding PCR products were purified using magnetic beads (HighPrep™ PCR,

MagBio, Gaithersburg, MA, USA). In the first sequencing run, we observed that short (~1 kb), off-

target DNA fragments were sequenced. Therefore, for the second run, to remove any DNA

fragments shorter than 3-4 kb, modified beads were made based on the protocol of Ramawater

and Schwessinger (20). In brief, Magbio beads (e.g. 5 mL) were pelleted and re-dissolved in buffer

containing 10 mM Tris-HCL, 1 mM EDTA pH 8, 1.6 M NaCl, 11% (w/v) PEG 8000, 0.20% (v/v)

Tween-20, and Millipore water to make 5 mL bead solution. For each sample, 0.8x volume of

beads was used.

Nanopore Sequencing Library Preparation

Each DNA library was prepared according to the 1D PCR barcoding (96) amplicons ONT protocol,

SQK-LSK109. Briefly, after pooling the barcoded amplicons, 200 fmoles of the DNA pool were

subjected to end-repair and ONT adapter ligation. After purification, approximately 350 ng (~80

fmoles) were introduced to the R9.4 flowcell to be sequenced for 48 hours on the GridION.

Nanopore Sequencing Data analysis

DNA sequences were extracted from fast5 files using Guppy v2.2.2 with flip-flop basecalling (ONT, Oxford, UK). Only pass reads (qscore > 7) were used for subsequent genotyping analysis as outlined in Figure 1. Guppy basecaller did not accommodate demultiplexing or length filtering when we performed this analysis, and these were done subsequently using Porechop (https://github.com/rrwick/Porechop) and NanoFilt (21). Filtered fastq files obtained from NanoFilt were then mapped to reference sequence(NG_008376.3, 8593 bps) using minimap2 (22) or NGMLR (23), and variants were called from the mapped bam files to a vcf file using nanopolish (24) or Clairvoyante (25). Threshold for calling variants was set at 0.2 for nanopolish and 0.25 for Clairvoyante as recommended. A trained model for ONT was also used when calling variants using Clairvyante. Variant phasing in samples containing more than one heterozygote variant was carried out using WhatsHap (26) with maximum coverage of 25X, resulting in phased VCF and phased BAM files. Quality control metrics were obtained using NanoOK (27) and MinIONQC (28).

Variant nomenclature follows the numbering based on NG_008376.3 counting from the sequence start. Haplotype information for each allele was determined by comparing the variants in each allele to the PharmVar haplotype table. Duplicated alleles were identified by examining the ratio of allele frequency between variants from the two alleles of each sample. The presence of duplicated alleles was indicated by a skewed allele balance from 1:1 to 2:1, or more in the case of multiple copies.

Genotype information for reference samples was available through the published Get-RM dataset (15). Genotype information for the clinical samples was determined using Sanger Sequencing based on key variants (Supplementary Table 2).

Sanger sequencing

Nested PCRs covering different regions (Supplementary Table 1) on the 1:1000 diluted 6.6 kb *CYP2D6* PCR product were performed and used for Sanger sequencing on an AB3130XL Genetic Analyzer (Thermo Fisher Scientific) (Supplementary Table 1). Nested PCRs were carried out in 20 µL reactions containing 1x PCR buffer, 1.5 mM $MgCl_2$, 0.2 mM dNTPs, 0.2 µM of each primer, 0.5 unit of TAQ-TI Heat-Activated DNA Polymerase (Fisher Biotec, Wembley, WA, Australia) and 2 uL of diluted PCR product. DNA was amplified in a touchdown PCR consisting of 15 cycles of 94°C for 15 seconds, 70°C for 15 seconds, and 72°C for 1 minute with annealing temperature decrease of 1°C/cycle followed by 20 cycles of 94°C for 15 seconds, 55°C for 15 seconds, and 72°C for 1 minute and a final extension at 72°C for 5 minutes. Sanger sequencing was performed using 1 µL product of nested PCR, 1 µL of primer, 1x sequencing buffer, and 0.5 µl of Big Dye Terminator

134   (ThermoFisher Scientific, Carlsbad, USA) in 10 μL reaction. Dye incorporation was performed in

135   a thermal cycler with 25 cycles of 96°C for 10 seconds, 50°C for 5 seconds, and 60°C for 4 minutes,

136   and subsequently purified using Sephadex G-50 (Sigma-Aldrich, Saint Louis, USA).

Results

Both sequencing runs resulted in similar yield (~3.6 gigabases), but different numbers of reads.

The first sequencing run resulted in more than 90% reads having length less than 6 kb, possibly

due to unspecific amplification during barcode PCR. In the second run, short reads were

significantly reduced and target sequences of 6 kb were enriched (~55% of total reads) with the

use of modified beads during PCR product purification (Figure 2). Although the first run resulted

in more reads in total, there were more barcoded reads with with >6 kb length in the second run

(35% compared to 4%). Despite the differences in number of reads between runs and between

samples, all samples had adequate coverage for subsequent analysis and genotyping, with the

lowest sample coverage at 235x (Table 1).

Comparison of Mapping and Variant Calling Tools

Amplicon data analysis was performed by comparing two mapping (minimap2 (22) and NGMLR

(23) and two variant calling tools (nanopolish (24) and Clairvoyante (25)), resulting in a total of

four different analyses. These comparisons were carried out with seven reference samples from

the first sequencing run. False positive and negative variants were confirmed by visually

inspecting the Binary Alignment MAP (BAM) file on Integrative Genomics Viewer (IGV, Broad

Institute, Boston, MA) (29). The minimum negative predictive value was 99.96% (NGMLR –

nanopolish) and the minimum accuracy was 99.68% (NGMLR – Clairvoyante). The calculation for

these two measurements was dominated by the relatively high number of true negative variants

(6514 – 6561 variants). Clairvoyante generally generated more false positive variants compared

with nanopolish, resulting in higher False Discovery Rate values (Table 2). In addition, we

observed a misalignment event in NGMLR in the intron 1 CYP2D7 conversion region (seven

SNPSs, 4414-4445) (Supplementary Figure 1). Due to this misalignment, the combination of

NGMLR and nanopolish inaccurately called 4423C>G and 4427T>C as 4423insG and 4427delT

(Supplementary Figure 1). Based on our analyses, the combination of minimap2 and nanopolish

for mapping and variant calling resulted in the highest sensitivity and positive predictive value

and lowest false discovery rate compared to the other tool combinations, and hence was used to

analyze the entire sample cohort.

CYP2D6 Genotyping Results

Together, the reference and clinical samples cover a total of 16 different star (*) alleles (*1, *2, *3, *4, *6, *7, *9, *10, *15, *17, *28, *29, *33, *35A, *41, and *71), as well as one sample with gene deletion (*5) and four samples with gene duplication. The only sample with a gene deletion (S022) was heterozygous, so only one allele was available to be sequenced. This allele contains a hemizygous variant (6684G>T), which corresponds to *33. This variant was confirmed on Sanger sequencing and the sample was assigned as *5/*33.

The genotyping results for all samples are shown in Table 3. Genotypes for all samples completely matched the reference genotypes based on getRM data and Sanger Sequencing, and 21 of them could be genotyped to the subvariant level, and matched to known subvariant catalogue entries on PharmVar. Five samples matched to certain alleles but not to the sub alleles, while six samples contained variants that did not match any known allele pattern on PharmVar. These findings are described below.

One sample (S016) contained only one variant (6504C>T, rs79738337) which is associated only with *60, but lacks the key variant of *60 (6088insTA). As 6504C>T is an intronic variant, we propose this sample to be a new subvariant of *1. Another sample (S007) had two variants (4325G>A and 5695T>C), associated with *71 but lacked the 2617C>G variant and therefore cannot be matched to either *71.001 or *71.002 as per the PharmVar catalogue. We propose this sample to be a new subvariant of *71.

One sample (S003) had a 6750delA variant in one allele which was called as *3. In the other allele, there are nine SNPs and one insertion variant, which taken together, cannot be matched to any star (*) allele in PharmVar (4470C>T, 7436A>G, 7455T>C, 7466G>A, 7585A>C, 7679A>G, 7685G>A, 7746insT, 7753C>T, 7783A>G). From the 10 variants found in this allele, three of them are in the exonic regions, one of which (7436A>G) is a missense variant, classified as moderate by Variant Effect Predictor (VEP, Ensembl) (30) and is one of the key variants associated with *108. However, the *108 allele has another key variant also in exon 7, 7427A>G (rs61736517), which was not present in our sample. 7466G>A, also a missense variant and predicted to be deleterious by VEP, has been associated with *4.021, but this sample lacks other key variants of *4. We propose this sample is a new allele.

We found five variants not yet catalogued in PharmVar. Two of the Coriell samples (NA18518 and NA23297) with *17 allele had an additional intronic variant (4853C>T, rs376217512). This is a rare variant with allele frequency (AF) of ~1%. One sample with variants matching to *41 allele (S013) contained two non-catalogued variants, 5578C>G (rs143170489) in intron 2 and 5814C>T (rs61736504) in exon 3. Both are rare with AF ~0.1%. The exonic variant is predicted

to be benign when annotated using VEP. Another sample with *4 allele (S023) also had a rare (AF:
0.001) intron 2 variant, 5604C>T, rs557722765.

The fifth variant not catalogued in PharmVar was an upstream variant (3836G>A, rs1080992)
which was found in four samples, and was the only variant in the particular allele of each sample.
This rare variant with an AF of less than 1% (7) has been reported in a non CEU population (31).
No functional information is available for this variant.

Detection of duplicated alleles

The presence of a duplicated allele in samples was determined by interrogating the ratio of
coverage between alleles. Samples without a duplication were expected to have a 1:1 ratio
between alleles, while samples with a duplication were expected have a skewed ratio of ~2:1
(Figure 3). All four samples which indicated gene duplication during the initial PCR screening
showed an uneven allele coverage ratio, and the duplicated alleles could be determined from the
over-represented allele. In addition, we sequenced the 8-kb fragments in three out of the four
samples with duplication. The 8-kb fragments originated only from the duplicated allele, and
aligned to the NG_008376.3 reference sequence from position 3860 to 8593. Sequencing of these
fragments revealed the same variants as the duplicated alleles identified from the 6 kb fragments
and thus confirmed the duplicated allele in all three samples (NA07439, NA23297, S018) (Table
4).

Validation of duplicated allele and variant phasing using the 8-kb fragment.

Interrogating the variants in the 8 kb fragments served two purposes. First, this information
identified the duplicated allele as explained in the previous section. Second, comparison of the
variants found in the 8-kb amplicon to those found in the 6.6kb amplicon allowed validation of
variant phasing performed in the 6.6 kb amplicon. All variants found in the 8-kb amplicons of the
three samples matched completely those found on the over-represented (duplicated) allele on
the 6.6 kb fragments. In addition to validation of the duplicated allele, this approach also validated
the accuracy of variant phasing of the 6.6kb amplicons. All phased variants in all samples could
be matched to a particular allele or subvariant, confirming the accuracy of variant phasing.

Identification and Filtering of False Positive Variants

Nanopore sequencing still fails to accurately basecall homopolymer strings. When aligned to the
reference, this usually leads to a drop in coverage and variant calling tools report this as a
deletion. Two to 13 false positive deletion/insertion events were found in each sample, and all
were in regions with three or more sequential identical bases. In addition to errors due to
homopolymers, false positive transition variants also occurred in two or three variants per

sample. These variants are non-random, always transitions (A↔G or C↔T) and called only in
specific position: 2381A>G, 2446T>C, 5207C>T, 6440T>C, 8046C>T, 8047C>T, and 8723G>A.
These false positive variants have lower quality in the nanopolish produced VCF files compared
to the true variants. We applied a previously reported strategy (32) by using quality/coverage
ratio to differentiate true and false variants. Most of the true variants have quality/coverage ratio
of >1, while most of the false variants have ratio < 0.5. For variants with ratio value between 0.5-
1, the trueness of the variant was determined visually in the BAM files using IGV.

Although all samples could be genotyped unequivocally, several variants failed to be detected and
were not reported in the VCF file. One variant that was present but not reported in many samples
was 5042T>G. This SNP sits between four Gs in the upstream and another G downstream, and
when the alternate G exists, the read depth dropped significantly, presumably due to the inability
of nanopore sequencing to detect homopolymers correctly. As a result, this SNP was often called
incorrectly as a T-deletion instead of a SNP. However this variant is quite common and is shared
by many alleles including the wildtype *1, *2, *4, *10, *41 and many others, and the absence did
not interfere with correct haplotyping of any sample.

Discussion

We performed long amplicon nanopore sequencing of the whole *CYP2D6* gene (including
upstream and downstream regions) on the GridION nanopore sequencing platform. To our
knowledge, this is the first extensive analysis of *CYP2D6* on a nanopore sequencing platform
across multiple star (*) alleles, including assessment of structural variation. An earlier report of
CYP2D6 nanopore sequencing only used one reference sample and was done on the earlier
version of ONT chemistry and flowcell. High error rates were associated with that version, and
unresolved ambiguity was reported in the sample diplotype, although variant phasing was
performed accurately (14). The initial relatively high error rate associated with nanopore
sequencing has improved as the technology continues to evolve. This is mainly attributed to
improvements in the pore, sequencing chemistries and bioinformatic algorithms available for
analysis. The accuracy of ONT nanopore sequencing has improved from less than 80% with the
R7.3 flowcell (33) used by Ammar et. al, to more than 90% with the current R9.4 version (34).

We used the R9.4 flowcell with 1D sequencing chemistry, and generated DNA sequences using
the recently updated guppy basecaller from ONT. Two different mapping and variant calling tools
were then used to analyze the reference samples to select the best bioinformatic workflow for
our dataset. We observed that a combination of minimap2 as a mapping tool and nanopolish as a
variant calling tool generated the least number of false positive and false negative variants

compared to other workflows. Using this combination of tools, the entire cohort of 32 samples in our study was accurately assigned to their star (*) alleles, with the addition of subvariant and duplicated allele information.

The advantages of long amplicon sequencing of *CYP2D6* have been recently reported by two papers, using the PacBio single molecule real-time (SMRT) sequencing platform (35, 36). Although currently the PacBio has lower error rates compared to current ONT nanopore sequencing, its utility might be limited by the high capital cost of the equipment. In contrast, ONT nanopore sequencing platforms have very low capital costs, and they also offer a unique opportunity to deliver results in real-time settings such as in the field (24, 37) or at point of care.

One of the issues reported with nanopore sequencing is the limitation in reliable detection of small insertion and deletion (indel) events (32, 38), and we encountered several false positive indels in homopolymer regions. However, true indels outside the homopolymer regions could be detected accurately, including key indel variants associated with *CYP2D6* star (*) alleles such as 6750delA (*3), 5098delT (*6), 6816delAAG (*9), and 4337insT (*15). All samples with these haplotypes could be identified accurately. In addition, other indel variants were also detected including 4933delC, 7746insA, and 8857delACA which are associated with several star (*) alleles including *2, *41, and *35.

The challenge that homopolymer regions present to nanopore sequencing also means that this technology remains limited for investigating the two long homoplymer strings of A's in the upstream region of the *CYP2D6* gene (2943-2964 and 3098-3107). The regions in between these two strings are notoriously difficult to sequence, resulting in a gap in most PharmVar catalouged alleles or subvariants. Variation in the number of A's within 2943-2964 has been reported previously (36), however this region has not been included as part of the haplotype definition (6). Although nanopore sequencing was not able to reliably detect variation in the poly A string, the regions adjacent to the strings were sequenced accurately in this study, including the detection of variants such as 2966A>G, which are still ambiguous in many star (*) alleles.

Sample barcoding permits efficient use of the flowcell and reduction in per sample assay costs. For high throughput laboratories or for research studies on larger cohorts, sample number could potentially be multiplexed up to 96 using the ONT barcode kit. Our 24-plex sequencing run resulted in the minimum read depth of ~500x, which is more than adequate for accurate variant calling and phasing, while some samples had tens of thousands of reads. The lowest read depth in our sample cohort was ~200x, and we observed no difference in accuracy compared to samples with higher read depth. Using nanopore sequencing to sequence a long amplicon from the *GBA* gene, Leija-Salazar et al reported that coverage >100x is sufficient for accurate variant calling (32).

The main advantage of long read sequencing is enabling straightforward variant phasing. In this
study, all variants could be phased accurately (provided more than one heterozygote variant is
present), resulting in highly confident haplotyping to the subvariant level. In addition, duplicated
alleles when present, were also identified. Using the 8-kb PCR amplicon derived from duplicated
alleles as a confirmation sequence, we showed that duplicated alleles could be detected from the
6-kb *CYP2D6* amplicon by the skewed allele balance of reads. The allele ratio could be observed
from the VCF file or by visualizing the phased BAM file on IGV. All our duplication samples have
an allele ratio of ~2:1, indicating two copies of the duplicated gene. Due to limitation of the
samples used in this cohort, it remains inconclusive whether this method could determine the
exact number of gene copies accurately in cases with more than two copies.

Nanopore based long read *CYP2D6* amplicon sequencing is an efficient tool for detecting key
alleles and haplotypes and challenges that may arise owing to gene deletion and conversion are
yet to be addressed using this method. The whole gene deletion allele (*5) still requires detection
by a separate duplex PCR, and despite the accurate determination of haplotypes and duplication,
the methods described here have not been extended to the detection of other CYP2D6 structural
variations such as the CYP2D6-CYP2D7 hybrids or tandem rearrangement.

Conclusion

In summary, nanopore sequencing of the *CYP2D6* gene allows accurate detection and phasing of
variants and determination of sample haplotypes to the subvariant level. New variants not yet
catalogued on the PharmVar CYP2D6 page (rs1080992, rs376217512, rs143170489,
rs61736504, rs557722765) were also reported in several samples, and key indel variants could
be reliably detected. The ability of nanopore sequencing to detect duplicated alleles when present
provides better prediction of CYP2D6 phenotype. In addition, sample barcoding permits
sequencing and analysis of multiple samples simultaneously, improving cost and time efficiency.

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Table 1. Metrics of first and second CYP2D6 sequencing runs

No.	Parameters	1st run	2nd run
1.	Total yield	3.24M reads (3.63 Gbases)	748K reads (3.62 Gbases)
2.	Read length	N50: 2955 bps Median: 307 bps	N50: 6741 bps Median: 6437 bps
3.	Number of barcodes	14	26
4.	Number of barcoded reads	690K reads (47.6% of total pass reads)	242K reads (46% of total pass reads)
6.	Number of barcoded reads with length > 6kb	57K reads (3.96% of total pass reads)	186K reads (35.4% of total pass reads)
7.	Number of reads per barcode (length > 6 kb and qscore > 7)	235-11832	555-21853
8.	Mean qscore[a]	6.1	8.1
9.	Error rates (subs – del – ins)[b]	6.53% - 4.56% - 5.13%	4.99% - 3.97% - 3.78%

a Mean qscores were obtained from MinION QC
b Error rates were obtained from NanoOK

Table 2. Comparison between mapping and variant calling tools

Mapping tool	Variant Calling Tool	TP Variants (median[range])	FN Variants (median[range])	FP Variants (median[range])	PPV (%)	FDR (%)	Sensitivity (%)
minimap2	nanopolish	27 [1-32]	1 [0-4]	6 [5-7]	79.12	20.87	96.43
minimap2	Clairvoyante	23 [1-33]	1 [0-5]	17 [10-19]	59.18	40.82	95.83
NGMLR	nanopolish	25 [1-30]	3 [0-6]	11 [6-13]	66.52	33.48	89.29
NGMLR	Clairvoyante	26 [1-30]	2 [0-4]	19 [12-21]	54.55	45.45	92.86

Abbreviation: TP: True Positive, FN: False Negative, FP: False Postive, PPV: Positive Predictive Value, FDR: False Discovery Rate. PPV, FDR, and Sensitivity were calculated based on median values.

Table 3 Genotyping Results

No.	Sample	Sequencing run	Reference Genotype (Get-RM or Sanger)	Allele	Genotype (GridION)	No. of Variants		
						subs	del	ins
Reference Samples								
1	NA07439	run 1	*4XN/*41	hap1	*4.004XN	15	0	0
				hap2	*41.003	23[a]	1	0
		run 2	*4XN/*41	hap1	*4.004XN	14[b]	0	0
				hap2	*41.003	22[a,b]	1	0
2	NA23348	run 1	*7/*35	hap1	*35.001	23[b]	1	0
				hap2	*7.001	1	0	0
		run 2	*7/*35	hap1	*7.001	1	0	0
				hap2	*35.001	23[b]	1	0
3	NA18518	run 1	*17/*29	hap1	*17.001	20[b]	0	0
				hap2	*29.001	17[c]	1	0
4	NA21781	run 1	*2/*4(XN)	hap1	*2.001XN	22[b]	1	0
				hap2	*4.001	14[b,d]	0	0
5	NA12878	run 1	*3/*4	hap1	*3.001	0	1	0
				hap2	*4.001	17[b]	0	0
6	NA23405	run 1	*1/*7	hap1	*7.001	1	0	0
				hap2	*1.001	0	0	0
7	NA23297	run 1	*10(XN) / *17	hap1	*17.001	20[b]	0	0
				hap2	*10.002XN	13[b]	0	0
Clinical Samples								
8	S001	run 1	*1/*1	hap1	*1.001	0	0	0
				hap2	*1	1	0	0
		run 2	*1/*1	hap 1	*1	1	0	0
				hap 2	*1.001	0	0	0
9	S002	run 1	*6/*4	hap1	*6.005	2	1	0
				hap2	*4.001	17[b]	0	0
		run 2	*6/*4	hap 1	*6.005	2	1	0
				hap 2	*4.001	17[b]	0	0
10	S003	run 1	*1/*3	hap1	new allele	9	0	1
				hap2	*3.001	0	1	0
11	S004	run 1	*4/*9	hap1	*4.001	17[b]	0	0
				hap2	*9.001	0	1	0
12	S005	run 1	*2/*10	hap1	*2.001	22[b]	1	0
				hap2	*10.002	13[b]	0	0
13	S006	run 2	*2/*9	hap 1	*2.001	22[b]	1	0
				hap 2	*9.001	0	1	0
14	S007	run 2	*71/*41	hap 1	*71	2	0	0
				hap 2	*41.001	22[b]	1	0

15	S008	run 2	*15/*2	hap 1	*15.001	1	0	1
				hap 2	*2.001	22[b]	1	0
16	S009	run 2	*1/*6	hap 1	*6.005	2	1	0
				hap 2	*1	1[b]	0	0
17	S010	run 2	*4/*10	hap 1	*10.002	13[b]	0	0
				hap 2	*4.015	18[b]	0	0
18	S011	run 2	*2/*2	hap 1	*2.001	22[b]	1	0
				hap 2	*2.001	22[b]	1	0
19	S012	run 2	*4/*4	hap 1	*4.001	17[b]	0	0
				hap 2	*4.001	17[b]	0	0
20	S013	run 2	*2/*41	hap 1	*41.001	23	1	0
				hap 2	*2.001	23	1	0
21	S014	run 2	*4/*28	hap 1	*28.001	25	1	0
				hap 2	*4.015	19	0	0
22	S015	run 2	*4/*35	hap 1	*4.001	18	0	0
				hap 2	*35.001	24	1	0
23	S016	run 2	*10/*1	hap1	*1	1	0	0
				hap2	*10.002	14	0	0
24	S017	run 2	*35/*41	hap1	*41.001	22[b]	1	0
				hap2	*35.001	23[b]	1	0
25	S018	run 2	*1/*1	hap1	*1.016XN	1[b]	0	0
				hap2	*1.012	2	0	0
26	S019	run 2	*1/*1	hap1	*1.012	1	0	0
				hap2	*1.001	0	0	0
27	S020	run 2	*1/*1	hap1	*1	1	0	0
				hap2	*1.001	0	0	0
28	S021	run 2	*1/*1	hap1	*1	1	0	0
				hap2	*1.001	0	0	0
29	S022	run 2	*5/*33	hap1	*5.001			
				hap2	*33.001	1	0	0
30	S023	run 2	*4/*4	hap1	*4.001	17[b]	0	0
				hap2	*4	18[b]	0	0
31	S024	run 2	*3/*4	hap1	*3.001	0	1	0
				hap2	*4.001	17[b]	0	0
32	S025	run 2	*4/*41	hap1	*41.001	22[b]	1	0
				hap2	*4.001	16[e]	0	0

a. Variant 7189G>A was not called in the vcf file but visually confirmed on Bam file.
b. Variant 5042T>G was incorrectly called as delT
c. Variant 6416A>G was not called in the vcf file but visually confirmed on Bam file.
d. Variants 2775C>T, 3201G>A and 4300C>T were not called in the vcf file but visually confirmed on Bam file.
e. Variant 2775C>T was not called in the vcf file but visually confirmed on Bam file.

Table 4. Variants in duplicated allele in 6.6kb and 8kb fragments.

No.	Sample	Variants found in duplicated allele in 6.6 kb amplicon (from position 3860 – 8593)	Variants found in 8.6 kb amplicon (from position 3860 – 8593)
1.	NA07439 (*4XN) (run 1)	4300C>T, 4510G>T, 5042T>G, 5238C>T, 5862G>C, 6047G>A, 6298A>G, 7585A>C, 7783A>G, 8381G>C, 8602C>T, 8923T>G	4300C>T, 4510G>T, 5238C>T, 5862G>C, 6047G>A, 6298A>G, 7585A>C, 7783A>G, 8381G>C, 8602C>T, 8923T>G *
2.	NA23297 (*10XN)	4300C>T, 4510G>T, 5238C>T, 5862G>C, 6298A>G, 7585A>C, 7783A>G, 8381G>C, 8602C>T, 8923T>G*	4300C>T, 4510G>T, 5238C>T, 5862G>C, 6298A>G, 7585A>C, 7783A>G, 8381G>C, 8602C>T, 8923T>G*
3.	NA07439 (*4XN) (run 2)	4300C>T, 4510G>T, 5238C>T, 5862G>C, 6047G>A, 6298A>G, 7585A>C, 7783A>G, 8381G>C, 8602C>T, 8923T>G *	4300C>T, 4510G>T, 5238C>T, 5862G>C, 6047G>A, 6298A>G, 7585A>C, 7783A>G, 8381G>C, 8602C>T, 8923T>G
4.	S018 (*1XN)	5369G>A*	5369G>A*

*5042 missed by the variant calling tool

Figure 1. Bioinformatics workflow for CYP2D6 nanopore sequencing

Figure 2. Read Length distribution of (A) first run, and (B) second run of CYP2D6 sequencing

*Figure 3. Phased variants for (A) sample with no duplicated allele (NA23348, *7/*35A) and (B) sample with duplicated allele (NA07439, *4XN/*41). Colours represent each of the phased alleles of the samples.*

Supplementary Figure 1. Misdetection of two out of the seven variants of intron 1 CYP2D7 conversion due to misalignment by NGMLR. The two variants were called incorrectly as insertion and deletion (4423insG and 4427delT) instead of the two variants of 4423C>G and 4427T>C.

Supplementary Table 1 Primer sequences

No.	Primer name	Sequence (5'-3')	Reference
Primers for long PCR			
1.	6.6kbF	tttctgttggtgctgatattgcATG GCA GCT GCC ATA CAA TCC ACC TG	(18)
2.	6.6kbR	acttgcctgtcgctctatcttcCGA CTG AGC CCT GGG AGG TAG GTA G	(18)
3.	FragD_8.6kbF	tttctgttggtgctgatattgcCCAGAAGGCTTTGCAGGCTTCAG	(18)
4.	FragD_8.6kbR	acttgcctgtcgctctatcttcCGGCAGTGGTCAGCTAATGAC	(18)
5.	CYP-13	ACC GGG CAC CTG TAC TCC TCA	(19)
6.	CYP-24	GCA TGA GCT AAG GCA CCC AGA C	(19)
7.	FragB_Dup_F	CCA TGG AAG CCC AGG ACT GAG C	(18)
8.	FragB_Dup_R	CGG CAG TGG TCA GCT AAT GAC	(18)
Primers for Sanger Sequencing			
1.	2D6_5UTRF	GCAGCTGCCATACAATCCAC	
2.	2D6_5UTRF	TGCTTTCTGGCCTCCATGTT	
3.	2D6Prom_R	TCCTCCATAACGTTCCCACCAGAT	(39)
4.	2D6Prom_F	CCATACCTGCCTCACTACCAAATG	(39)
5.	2D6Ex1F	TCTGGAGCAGCCCATACCCG	(39)
6.	2D6Ex1SR	CCCCAGACTACAGGTCCTAGTCCTATTTG	(12)
7.	2D6Ex2F	TCCTCCTTCCACCTGCTCAC	(39)
8.	2D6Ex2SR	CTTTGCCCCACCTCGTCTCT	(39)
9.	2D6Ex34F	AGCTGGAATCCGGTGTCGAA	(39)
10.	2D6Ex34SR	AGCCATCTCCAGGTAGACCCAG	(39)
11.	2D6Ex56F	ACAGGCAGGCCCTGGGTCTA	(12)
12.	2D6Ex56SR	CCTGGTCACCCATCTCTGGTC	(39)
13.	2D6Ex7F	CCAACATAGGAGGCAAGAAG	(39)
14.	2D6Ex7R	ACTGGACTCTAGGATGCTGG	(39)
15.	2D6Ex8F	CAGAATGTTGGAGGACCCAA	(39)
16.	2D6Ex8R	AGGAAAGCAAAGACACCATG	(39)
17.	2D6Ex9F	TGAAGGATGAGGCCGTCTGG	(39)
18.	2D6-R	ACTGAGCCCTGGGAGGTAGGTAG	(39)

Supplementary Table 2. Sequence variants to detect star (*) alleles in Sanger Sequencing

Star (*) Alleles	Variants	
	RSID	Position based on NG_008376.3 (1=sequence start)
*2	rs16947	7051C>T
*3	rs35742686	6750delA
*4	rs1065852, rs3892097	4300C>T, 6047G>A,
*6	rs5030655	5098delT
*7	rs5030867	7136A>C
*9	rs5030656	6816delAAG
*10	rs1065852	4300C>T
*15	rs774671100, rs1081004	4337insT, 5369G>A
*17	rs28371706	5222C>A/T
*28	rs72549358, rs78482768	4219G>A, 5905C>G
*29	rs61736512, rs59421388	5860G>A, 7384G>A
*33	rs28371717	6684G>T
*35	rs769258	4231G>A
*41	rs28371725	7189G>A
*71	rs118203758	4325G>A

Supplementary File 1

Protocol for DNA extraction from blood samples

For each patient sample, 4 mL of peripheral blood will be mixed with 6 mL of red blood cell lysis buffer (1 mM EDTA) and spun at 2000 rcf for 10 minutes at room temperature. The supernatant will be carefully discarded and the pellet resuspended and the initial step repeated until a layer of white buffy cells is clearly visible. The supernatant can then be discarded and 1 mL of 1 M NaCl solution added. This solution is then repeatedly vortexed to eliminate any clumping. Once the solution is clear of clumps, 6 mL of white cell lysis solution (10 mM Tris HCl, 26 mM EDTA, 17.3 mM (0.5%) SDS) and 50 µL of RNase A solution is added and incubated at 37°C for at least 1 hour.

After incubation 1mL of 3M sodium acetate solution is added and mixed. The resulting solution is then added to a 15 mL tube containing 2.5 gr of high vacuum grease (Dow Corning Corporation, USA) and then 1 ml of phenol:chloroform:isoanyl alcohol 25:24:1 was added. The tubes are then capped and thoroughly mixed before centrifuging for 5 minutes at 1500 rcf. Five mL of the resultant supernatant is then transferred to a new tube containing 5mL of 100% isopropanol. The tubes are then gently inverted until DNA precipitates. The tubes containing DNA are then centrifuged at 2000 rcf for 5 minutes to form a DNA pellet at the bottom of the tube. The isopropanol is then carefully discarded and then washed with 10 mL of 70% ethanol (10 mL) by centrifuging at 2000 rcf for 3 minutes. After discarding the ethanol, the DNA pellet is dissolved in 500 mL of TE buffer (10 mM Tris-HCl, 1 mM EDTA, pH 8.0) at 37°C for at least 8 hours. The DNA solution were quantified using a spectrophotometer at 260 nm and diluted to 50 ng/µL.

EDTA: Ethylenediaminetetraacetic acid

TRIS HCL: tris(hydroxymethyl)aminomethane hydrochloric acid

SDS: Sodium dodecyl sulfate

TE buffer: Tris-EDTA buffer

NaCl: Sodium chloride