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# Molecular Diagnosis of Autosomal Dominant Polycystic Kidney Disease Using Next-Generation Sequencing

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Autosomal dominant polycystic kidney disease (ADPKD) is caused by mutations in *PKD1* and *PKD2*. However, genetic analysis is complicated by six PKD1 pseudogenes, large gene sizes, and allelic heterogeneity. We developed a new clinical assay for PKD gene analysis using paired-end next-generation sequencing (NGS) by multiplexing individually bar-coded long-range PCR libraries and analyzing them in one Illumina MiSeq flow cell. The data analysis pipeline has been optimized and automated with Unix shell scripts to accommodate variant calls. This approach was validated using a cohort of 25 patients with ADPKD previously analyzed by Sanger sequencing. A total of 250 genetic variants were identified by NGS, spanning the entire exonic and adjacent intronic regions of PKD1 and PKD2, including all 16 pathogenic mutations. In addition, we identified three novel mutations in a mutation-negative cohort of 24 patients with ADPKD previously analyzed by Sanger sequencing. This NGS method achieved sensitivity of 99.2% (95% CI, 96.8%-99.9%) and specificity of 99.9% (95% CI, 99.7%-100.0%), with cost and turnaround time reduced by as much as 70%. Prospective NGS analysis of 25 patients with ADPKD demonstrated a detection rate comparable with Sanger standards. In conclusion, the NGS method was superior to Sanger sequencing for detecting PKD gene mutations, achieving high sensitivity and improved gene coverage. These characteristics suggest that NGS would be an appropriate new standard for clinical genetic testing of ADPKD. (J Mol Diagn 2014, 16: 216-228; <http://dx.doi.org/10.1016/j.jmoldx.2013.10.005>)

Autosomal dominant polycystic kidney disease (ADPKD) affects 1 in 400 to 1 in 1000 live births worldwide.<sup>1</sup> It is the most common inherited kidney disease, accounting for approxi-mately 5% of the end-stage renal disease population.<sup>[2](#page-11-1)</sup> ADPKD is initiated by gene mutations in renal tubular epithelial cells, which seem to be more sensitive to haploinsufficiency, resulting in increased proliferation and cyst formation.<sup>3</sup> The consequent increase in the number and size of kidney cysts causes progressive chronic kidney disease.[4](#page-11-3) ADPKD is mainly caused by mutations in two large genes, PKD1 and PKD2, accounting for 75% to 85% and 15% to 25% of cases, respectively, in

clinically well-characterized populations. PKD1 spans 46 exons and encodes polycystin-1 with 4303 amino acids.<sup>5</sup> PKD2 spans 15 exons, encoding polycystin-2, which consists of 9[6](#page-11-5)8 amino acids.<sup>6</sup> Chromosome 16 includes six homologous genes (ie, pseudogenes) that share 97.7% sequence identity with the *PKD1* gene exons 1 to  $33^{7,8}$ 

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The clinical diagnosis of ADPKD is established by family history and renal imaging modalities, such as ultrasonography, computed tomography, and magnetic resonance imag-ing.<sup>[9](#page-11-7)</sup> However, these diagnostic test results are often ambiguous, particularly in young individuals. Consequently, genetic testing plays an increasingly important role in the diagnosis and management of patients with ADPKD.<sup>10</sup> Moreover, with the development of potentially effective pharmacologic treatments for ADPKD, $^{11}$  $^{11}$  $^{11}$  the need for accurate diagnostic genetic tests has become more compelling.

The key step in ADPKD genotyping procedures is amplification of the *PKD1* gene region while excluding the pseudogenes. This was traditionally achieved by using long-range PCR (LR-PCR) with primers located to the rare mismatch sites that distinguish PKD1 and the pseudogenes, followed by nested PCR of the individual exons, whereas the single-copy regions of PKD1 and PKD2 were directly amplified from genomic DNA. Amplicons were then directly analyzed by Sanger sequencing or by sequencing coupled with a mutation screening step to lower the testing cost.<sup>12,13</sup> However, the genetic analysis of ADPKD is challenging, especially owing to the large size, complex genomic structure, and allelic heterogeneity of PKD1 and  $PKD2$ .<sup>[14](#page-11-11)</sup> Next-generation sequencing (NGS) technology has revolutionized the field of human genetics and molecular di-agnostics.<sup>15,16</sup> Recently, Rossetti et al<sup>[17](#page-11-13)</sup> reported a mutation screening strategy for analyzing PKD genes using NGS by pooling LR-PCR amplicons and multiplexing bar-coded libraries. This approach was designed to have a high throughput and has been successful for screening mutations in large cohorts. However, the method had low sensitivity and slow turnaround time, mainly because of the sample pooling strategy used.

Herein, we present a new NGS-based genotyping approach for patients with ADPKD that is better tailored to the standard clinical diagnostic setting, where rapid turnaround time and high sensitivity could be achieved by individually bar coding each patient in the run. The diagnostic performance of the new assay was evaluated using a panel of DNA samples previously analyzed by Sanger sequencing.<sup>[18](#page-12-0)</sup> The testing strategy, workflow, data analysis pipeline, costs, and other related issues are also discussed.

## <span id="page-1-0"></span>Materials and Methods

#### Study Patients

Study patients were participants in The Rogosin Institute Polycystic Kidney Disease Data Repository ([http://www.](http://www.clinicaltrials.gov) [clinicaltrials.gov](http://www.clinicaltrials.gov), Identifier NCT00792155). This is a singlecenter, prospective, longitudinal study of genotype and phenotype characteristics of individuals with ADPKD. Study samples were randomly selected for analysis. All the participants underwent PKD genotyping by the Weill Cornell Medical College Molecular Pathology Research Laboratory (New York, NY) using direct sequencing or SURVEYOR nuclease-WAVE screening (Transgenomic Inc., Omaha, NE). In addition, we prospectively analyzed a new cohort of patients with ADPKD

that has not been previously genotyped. The study was approved by the Institutional Review Board Committees at Weill Cornell Medical College and The Rockefeller University (New York, NY). All the participants provided written informed consent.

#### Long-Range PCR

Genomic DNA was extracted from peripheral blood lymphocytes using a Gentra Puregene blood kit (Qiagen Inc., Valencia, CA). The entire coding region, the exon-intron boundaries, and most of the 5<sup> $\prime$ </sup> and 3<sup> $\prime$ </sup> untranslated regions of *PKD1* and *PKD2* were amplified in a total of 10 (five reactions per gene) distinct PCR reactions using primers anchored either in the rare mismatched region with the human homologs or in the single-copy region of PKD1. The LR-PCR primers were designed using Primer3 software version 4.0.0 (<http://bioinfo.ut.ee/primer3>, last accessed October 25, 2013) [\(Table 1](#page-2-0)).<sup>[19](#page-12-1)</sup> The LR-PCR primers were modified at the  $5'$  end with NH2 to prevent overrepresentation of sequences at the amplicon ends in the ligation step and to increase sequence coverage uniformity.<sup>[20](#page-12-2)</sup> LR-PCR was performed using either the GeneAmp high fidelity PCR system (Applied Biosystems, Foster City, CA) or the PrimeSTAR GXL DNA polymerase (Takara Bio Inc., Shiga, Japan). PCR amplification conditions for the various LR-PCR fragments are described in Supplemental Table S1. After purification with Agencourt AMPure XP beads (Beckman Coulter, Beverly, MA), the LR-PCR fragments from each patient were quantified using PicoGreen (Quant-iT; Invitrogen, Carlsbad, CA) and were pooled together at equal molar ratio.

#### Library Preparation and Indexing

For each patient, 4 µg of LR-PCR products were pooled together in a total reaction volume of  $210 \mu L$  of Tris-EDTA buffer and were fragmented to approximately 300 bp using adaptive focused acoustics (Covaris S2; LGC Ltd., Teddington, UK) with the following settings: duty cycle, 20%; intensity, 5; and cycles per burst, 200. After shearing, the fragments underwent end repair using the NEBNext end repair module (New England BioLabs Inc., Ipswich, MA) by adding 3' dA overhangs to the blunt-ended DNA. After purification on AMPure XP beads, unique indexed adaptors were ligated to each patient pool using the NEBNext quick ligation module (New England BioLabs Inc.). Twenty-five different adapters with 5-nt bar codes were used for indexing and library preparation. The bar codes located in the  $3'$  end of each adapter were designed using a published Python script (create\_index\_sequences.py) $^{21}$  $^{21}$  $^{21}$  with a minimum edit distance, or mutation tolerance, of three. Each adapter sequence began with the paired-read oligonucleotide sequences as specified by Illumina Inc. (San Diego, CA): 5'-GATCGGAAGAGCGG-TTCAGCAGGAATGCCGAG-3' and 5'-ACACTCTTTC-CCTACACGACGCTCTTCCGATCT-3'. Annealing of the indexed adaptors was performed at  $95^{\circ}$ C for 2 minutes, followed by a cooldown to room temperature at a rate of  $0.1^{\circ}$ C per second using a thermal cycler (Biometra GmbH,

Goettingen, Germany). The ligation products were then purified with AMPure XP beads and subjected to size selection using 2% E-Gel SizeSelect (Invitrogen). The selected 500-bp libraries were then amplified by PCR using AccuPrime Taq high fidelity (Invitrogen) with the PCR primers (Illumina Inc.) 5′-AATGATACGGCGACCACCGAGATCTACACTCTT-TCCCTACACGACGCTCTTCCGATCT-3' and 5'-CAA-GCAGAAGACGGCATACGAGATCGGTCTCGGCATTC-CTGCTGAACCGCTCTTCCGATCT-3' and the following PCR conditions: 98°C for 3 minutes, 10 cycles at 98°C (80 seconds), and  $65^{\circ}$ C (90 seconds), followed by a final extension step at 65°C for 10 minutes using a thermal cycler (Biometra GmbH).

# Library Pooling and Illumina Sequencing

PCR library products from each patient were purified with AMPure XP beads, quantified, and pooled together at equimolar amounts in groups of 25 samples. The finished libraries were quantified using the PicoGreen method (Invitrogen) and were analyzed using the DNA highsensitivity chip on an Agilent 2100 Bioanalyzer system (Agilent Technologies Inc., Santa Clara, CA) for quality control purposes and for assessing the library size. Each library pool was then diluted to 10 nmol/L and was loaded onto a flow cell of the MiSeq system (Illumina Inc.) and subjected to cluster generation and sequencing using a paired-end 150-bp cycle protocol according to the manufacturer's instructions. Typically, this read length enables the detection of indels of approximately 1 to 51 bp using the computational pipeline. An average MiSeq run generates 6.14 million reads with 5.74 million pass filter reads, and 77.1% of reads have a high quality score >Q30.

# Data Analysis Pipeline

For data analysis, Illumina sequencing reads in FASTQ format were first subjected to quality control checks using the FastQC program ([http://www.bioinformatics.babraham.](http://www.bioinformatics.babraham.ac.uk/projects/fastqc) [ac.uk/projects/fastqc](http://www.bioinformatics.babraham.ac.uk/projects/fastqc), last accessed October 25, 2013). The reads were then sorted according to their bar code by FastqMultx[22](#page-12-4) ([https://code.google.com/p/ea-utils/wiki/Fastq](https://code.google.com/p/ea-utils/wiki/FastqMultx) [Multx](https://code.google.com/p/ea-utils/wiki/FastqMultx), last accessed November 3, 2013) or the FASTQ/A barcode splitter program in the FASTX-Toolkit ([http://](http://hannonlab.cshl.edu/fastx_toolkit/index.html) [hannonlab.cshl.edu/fastx\\_toolkit/index.html](http://hannonlab.cshl.edu/fastx_toolkit/index.html), last accessed October 25, 2013). Reads were then paired-end aligned using the Burrows-Wheeler Aligner (BWA) program version  $0.5.9$ rc $1<sup>23</sup>$  $1<sup>23</sup>$  $1<sup>23</sup>$  to a modified version of the human genome assembly hg19, where all the nucleotides outside the PKD1/ PKD2 loci are masked and replaced with Ns. This procedure has the advantage of maintaining the genomic coordinates of the variants and enabling subsequent variant annotation using standard NGS analysis software (eg, ANNOVAR). Because the PKD1 pseudogenes are effectively masked, reads cannot be erroneously mapped to these genomic regions. Sequence variants were called using the Genome Analysis Toolkit (GATK) software package version 1.6 (Broad Institute, Cambridge,  $MA$ ),<sup>24</sup> carefully following the best practice guidelines rec-ommended by GATK,<sup>[25](#page-12-7)</sup> including initial read mapping, local realignment particularly around indels, followed by base quality score recalibration. Single nucleotide variations (SNVs) and INDELs were called simultaneously on all 25 samples with the default setting of GATK Unified Genotyper on the realigned and recalibrated reads, followed by SNV and INDEL filtering to eliminate false-positive calls. The GATK uses the Phred scaled probability that a reference/alternative (ALT) polymorphism exists at a given site (given sequencing data) as

<span id="page-2-0"></span>Table 1 LR-PCR Primers for NGS Sequencing

Fragment	<b>Primers</b>	Sequence	Size (kb)	Genomic location
PKD1 Ex1	PKD1 NGS 1F	$5'$ -CGCAGCCTTACCATCCACCT-3'	2.3	chr16:2185030-2187307
	PKD1 NGS 1R	5'-TCATCGCCCCTTCCTAAGCA-3'		
<i>PKD1</i> Ex2-12	PKD1 NGS 2-12F	5'-CCAGCTCTCTGTCTACTCACCTCCGCATC-3'	8.7	chr16:2163080-2171636
	<b>PKD1 NGS 2-12R</b>	5'-CCACGGTTACGTTGTAGTTCACGGTGACG-3'		
PKD1 Ex13-21	PKD1 NGS 13-21F	$5'$ -TGGAGGGAGGGACGCCAATC-3'	7.9	chr16:2155145-2163036
	PKD1 NGS 13-21R	5'-ACACAGGACAGAACGGCTGAGGCTA-3'		
PKD1 Ex22-34	<b>PKD1 NGS 22-34F</b>	5'-ATGCTTAGTGAGGAGGCTGTGGGGGTC-3'	7.8	chr16:2146980-2154794
	PKD1 NGS 22-34R	5'-ATGAGGCTCTTTCCACAGACAACAGAGGTT-3'		
PKD1 Ex35-46	PKD1 NGS 35-46F	5'-CTGTGGGCGATGGGTTTATCAGCAG-3'	5.2	chr16:2139301-2144473
	PKD1 NGS 35-46R	5'-GAGACGGTGCAGGGAGTACGGTAGGA-3'		
PKD2 Ex1	PKD2 NGS ExP-1 F	5'-GTGGAGACAGAAGCCAACCAAAGAG-3'	1.4	chr4:88928226-88929584
	PKD2 NGS ExP-1 R	5'-GGATGCGAGATGGAGCCCG-3'		
PKD2 Ex2	PKD2 NGS Exon2 F	5'-TTTCTTTCCATTTGCAATGTTTCATTC-3'	2.5	chr4:88938491-88940897
	PKD2 NGS Exon2 R	5'-GGAAGATAGTCAATAAACAAATGCCCAA-3'		
<i>PKD2</i> Ex3-6	PKD2 NGS Ex3-6 F	5'-GAGAAGACCTTGTGTGAATTTGTCCA-3'	10.9	chr4:88957246-88968207
	PKD2 NGS Ex3-6 R	5'-TCATACTCAGCAAAGTTACTCATGCAAA-3'		
PKD2_Ex7-10	PKD2 NGS Ex7-10 F	5'-TCGGGTAAGTATAATGGTGAGCCCT-3'	10.3	chr4:88973018-88983323
	PKD2 NGS Ex7-10 R	5'-CATCAAGACTCCAAGATAGGGAACATTT-3'		
PKD2 Ex11-15	PKD2 NGS Ex11-15 F	5'-CACGTACTTGTTGAATGGCCAATGT-3'	10.8	chr4:88986401-88997197
	PKD2 NGS Ex11-15 R	5'-ATGAAACTCAGAAGCCCTTTGACAGTT-3'		

the main metric for calling polymorphic sites. This metric is called QUAL in the GATK output, and we require that QUAL 50 together with additional filters based to define a site as PASS. The GATK command line we used is shown in Supplemental Table S2. For each patient, genotyping likelihood was then defined for the AA, A/B, and BB genotypes, and A/B and BB calls were used as variant calls. We did not specify a percentage of ALT allele threshold (defined as second number allelic depth tag in the VCF file divided by depth of coverage); however, we determined in postvariant calling analyses that the percentage of ALT allele was >12% for all variants called. The minimum number of reads supporting the ALT allele for the called variants was  $10\times$ . The minimum depth of coverage for the variants was  $39\times$ . Given that we obtained excellent sensitivity and specificity using current

parameters, as noted in *Results*, we did not introduce any additional filters based on ALT allele percentage but continue to rely on GATK genotype likelihoods. A variant call was filtered out with any of the following criteria met: i) SNVs in clusters (three SNVs within 10 bp of each other), ii) more than four reads with mapping quality of zero and  $>10\%$  of reads with mapping quality of zero, iii) strand bias higher than or equal to  $-1.0$ , iv) SNV quality score  $\langle 30, 1 \rangle$ v) quality-by-depth score <1.5, vi) largest contiguous homopolymer run of variant allele  $>10$ , and vii) depth of coverage less than fivefold. After filtering, variant calls were annotated using ANNOVAR software version 2012,  $^{26}$  $^{26}$  $^{26}$ and the final genotyping reports were then generated. The entire data analysis pipeline was automated using Unix shell scripts, with raw lllumina sequencing as input and final

<span id="page-3-0"></span>

Figure 1 Visualization of the NGS workflow. PKD1 and PKD2 genes were individually amplified as 10 locus-specific LR-PCR products (1.4 to 10.9 kb in size), with all coding regions and most intronic regions covered, in total, an approximately 68.0 kb genomic region. A: Map of the PKD1 and PKD2 genes showing the position of the 10 pairs of primers used for LR-PCR amplification of the coding regions. The highlighted green and yellow regions correspond to the duplicated and single-copy sequences of PKD1, respectively. B: Amplification quality was verified using agarose gel electrophoresis. C: LR-PCR products from each patient were pooled together at equimolar ratio, followed by fragmentation and library preparation. The finished libraries were quantified and batched together at equimolar amounts in groups of 25 patient samples and were assessed for quality by a high-sensitivity chip using an Agilent Bioanalyzer instrument. D: The pooled libraries were sequenced on an Illumina MiSeq platform. The raw sequencing reads were sorted by bar code first and then were subjected to quality control analysis before proceeding with the mutation analysis. The quality score (Phred-like score) is shown at each position of the reads. E: Reads were then mapped back to the PKD1/PKD2 loci of human genome assembly hg19 using the BWA program. In this example, PKD1 sequencing coverage is shown using the Integrative Genomics Viewer (Broad Institute, Cambridge, MA). Red areas, reads from the plus DNA strands; blue areas, reads from the minus strands. F: Variant callings were made by the GATK software package and were visualized using the Integrative Genomics Viewer. Ex, exon; FU, fluorescence unit.

<span id="page-4-0"></span>

Figure 2 Illustration of the data analysis pipelines. Listed are the analysis steps (A) and the corresponding software/application programs involved (B).

genotyping reports as output. In the present study, we restricted analysis to the coding exons and 20 bp of the flanking intronic regions. Statistical computations were performed using R version 3.0.1 software (The R Foundation for Statistical Computing, <http://www.r-project.org>).

#### Assay Analytical Characteristics

An evaluation of the assay analytical characteristics was performed using only variants located in regions analyzed by both NGS and Sanger sequencing and compared herein. Positive results were defined as all variant alleles detected by NGS in the 25-patient cohort. Negative results were defined as genotypes identical to the reference sequence at genomic sites where variants are found across the 25 patients. The new assay was evaluated for sensitivity and specificity using the following formulas:

Sensitivity  $=$  number of true-positives/(number of truepositives  $+$  number of false-negatives),

Specificity  $=$  number of true-negatives/(number of truenegatives  $+$  number of false-positives).

## Reference Sequences, Variant Nomenclature, and Variant of Uncertain Significance Scoring

NCBI RefSeq sequences were used for reference sequence: PKD1, NM\_000296.3; PKD2, NM\_000279.3. The standard nomenclature recommended by the Human Genome Variation Society (<http://www.hgvs.org/mutnomen>, last accessed October 25, 2013)<sup>[27](#page-12-9)</sup> was used to number nucleotides and name mutations or variants. All sequence variant descriptions were checked for accuracy using the Mutalyzer 2.0 program (<http://www.mutalyzer.nl/2.0>, last accessed October 25, 2013). Variants of uncertain significance were classified based on computational analysis scores as previ-ously described.<sup>[18](#page-12-0)</sup>

## Results

#### LR-PCR-Based NGS Analysis of Pooled Control Samples

To improve ADPKD testing and eliminate the need for Sanger sequencing, we used an LR-PCR NGS strategy to specifically amplify and directly sequence the entire coding region of both PKD1 and PKD2 genes for up to 25 patients in a single sequencing reaction. An overview of the NGS workflow is shown in [Figure 1](#page-3-0), which includes a diagram of the PKD genes and the relative primer pair positions, LR-PCR enrichment and product analysis, and data analysis steps. The unique LR-PCR oligonucleotides have been carefully designed to cover approximately 67.8 kb of genomic sequence, including all exonic sequences and flanking intronic regions (see *[Materials and Methods](#page-1-0)*). Agarose gel electrophoresis with ethidium bromide staining of the LR-PCR products demonstrated specific fragments ranging in size from 1.4 to 10.8 kb, each covering 1 to 11 exons corresponding to the sequence of PKD1 and PKD2 [\(Figure 1\)](#page-3-0). For evaluating the NGS workflow, we pooled individually bar-coded sequencing libraries from up to 25 patients onto a single flow cell of the MiSeq system (Illumina Inc.) and subjected it to cluster generation and sequencing using paired-end sequencing. We analyzed the sequencing results using an automated NGS data analysis pipeline combining the FastQC, FASTX-Toolkit, BWA, GATK, and ANNOVAR software packages, as illustrated in [Figure 2](#page-4-0). The Sanger sequencing-verified gene variations allowed a detailed analysis of read depth (number of reads per known variant), coverage (percentage of the regions of interest adequately covered), sensitivity (proportion of true-positives), and specificity (proportion of true-negatives).

Using this approach, 85% of all sequenced reads mapped to the PKD1/2 reference genome. Of these mapped reads,  $100\%$ mapped back to the targeted *PKD1* and *PKD2* regions. Overall, a very high read depth was obtained across all PKD gene target regions, with >93% of targeted sequences covered with  $>30\times$  for the entire amplicon. Focusing on exonic

<span id="page-4-1"></span>

**Figure 3** Read depth and coverage analysis results. Plot shows the base coverage (y axis) of each LR-PCR amplicon of the PKD1 and PKD2 genes of one patient. The  $x$  axis represents the genomic interval. The average read depth for each fragment is indicated under each amplicon. The plots were generated using the Integrative Genomics Viewer. Ex, exon.

<span id="page-5-0"></span>

**Figure 4** Visualization of typical PKD1 NGS gene variation calls. A nonsense mutation (A) and a 10-bp deletion variant  $(B)$  are shown. NGS reads were piled up and are shown on the Integrative Genomics Viewer on top; Sanger sequencing confirmations are shown below.

regions, we calculated the minimum, maximum, and average read depth for all *PKD1* and *PKD2* exons extending 20 bp from each end. This analysis demonstrated that except for two patients with a failed PCR product encompassing a single exon and PKD1 exon 1 (see below for explanation), all the exons had minimum coverage  $\geq 11 \times$ , average coverage  $\geq 103 \times$ , and maximum coverage  $>127\times$ . For most exons (53 of 60), minimum coverage was  $\geq 50 \times$ . The minimum, maximum, and average read depths as well as quality metrics for all the exons are provided in Supplemental Tables S3 and S4, respectively. For *PKD1* exon 1, which contains a highly GC-rich region centered approximately on the start codon, there was a low minimum coverage in several of the patients (down to  $0\times$  at one to two nucleotides). The length of the poorly covered region (defined as a region in which one or more patients had  $\langle 5 \times$  coverage) was 156 bp (chr16:2185623-2185778), suggesting that, except for this sequence, accurate variant calling is possible across all the *PKD1* and *PKD2* exons. Representative read depth and coverage analysis results are shown in [Figure 3](#page-4-1). For this typical sample, 100% of the targeted region was covered  $>15$ -fold depth, and 93% of the targeted region was covered  $>$ 30-fold depth, with *PKD1* exon 1 having the lowest read depth because of its extremely high GC content (approximately 85%) and low complexity.

Based on these results, SNVs and small insertion/deletion variants (three deletions of 10, 4, and 2 bp in length and one 24-bp-long insertion) ([Figure 4\)](#page-5-0) were detected, indicating that multiplexing of LR-PCR libraries did not compromise sensitivity or specificity rates.

#### NGS Variant Analysis

Using this method, we validated a cohort of 25 patients who have been previously genotyped by Sanger sequencing. The samples selected harbored gene variations spanning the entire genetic sequence of *PKD1* and *PKD2*. Data mining has correctly identified all 250 Sanger sequencing changes (corresponding to 83 gene variations), indicating that the NGS method has a diagnostic performance comparable with that of the direct sequencing approach currently used in our laboratory (Weill Cornell Medical College Molecular Pathology Research Laboratory, New York, NY). However, in one of these patients, two changes (*PKD1* c. 7165T>C:p.  $=$  and PKD1 c. 6598 C>T:p.R2200C) were incorrectly identified as homozygous by NGS rather than as heterozygous. Further investigation using Sanger sequencing of the NGS LR-PCR product revealed that both variants were located in the same amplicon and that the miscalling resulted from allele dropout of the reference allele (data not shown).

Investigation of the distribution of the ALT alleles showed two sharp peaks centered on 50% ALT frequency and near 100% frequency ([Figure 5](#page-5-1)). Most variants (90.5%) were within the expected 40% to 60% or >90% ALT allele frequency range. We identified 16 variants with <40% ALT allele frequency. Of these, two variants had relatively low coverage (56 $\times$  and 39 $\times$ ),

<span id="page-5-1"></span>

**Figure 5** Distribution of the ALT allele frequencies. The analysis was performed using R software version 3.0.1 (<http://www.r-project.org>). The results are shown as a function of the ALT allele frequency percentage.

<span id="page-6-0"></span>Table 2 Details of PKD1 and PKD2 Variants Analyzed in the Cohort of 25 Sanger Sequencing—Confirmed Patients with ADPKD Analyzed by NGS Chromosome Position dbSNP ID REF ALT Gene Intron Exon/ Function Variant nomenclature QUAL FILTER 16 2139875 rs62038811 G A PKD1 Exon46 Synonymous SNV NM\_000296.3:c.12762C>T:p.= 4925.23 PASS 16 2140010 rs7203729 A G PKD1 Exon46 Synonymous SNV NM\_000296.3:c.12627T>C:p.= 11,757.62 PASS 16 2140177 A C PKD1 Exon46 Nonsynonymous SNV NM\_000296.3:c.12460T>G:p.F4154V 5601.09 PASS 16 2140321 rs79899502 G A PKD1 Exon45 Synonymous SNV NM\_000296.3:c.12406C>T:p.= 10007.98 PASS 16 2140454 rs3087632 T C PKD1 Exon45 Synonymous SNV NM\_000296.3:c.12273A>G:p.= 28352.74 PASS 16 2140554 rs3209986 G A PKD1 Exon45 Nonsynonymous SNV NM\_000296.3:c.12173C>T:p.A4058V 11352.25 PASS 16 2140680 rs10960 T C PKD1 Exon44 Nonsynonymous SNV NM\_000296.3:c.12130A>G:p.I4044V 28827.19 PASS 16 2141454 G A PKD1 Exon42 Synonymous SNV NM\_000296.3:c.11679C>T:p.= 2940.32 PASS 16 2141522 C A PKD1 Exon42 Stopgain SNV NM\_000296.3:c.11611G>T:p.E3871X 4450.2 PASS 16 2142573 C G PKD1 Exon39 Nonsynonymous SNV NM\_000296.3:c.11174G>C:p.W3725S 4102.69 PASS 16 2144026 GA G PKD1 Intron35 Intronic deletion NM\_000296.3:c.10616-13delT 6754.83 PASS 16 2144123 G A PKD1 Exon35 Stopgain SNV NM\_000296.3:c.10585C>T:p.Q3529X 2175.31 PASS 16 2144176 rs34197769 G A PKD1 Exon35 Nonsynonymous SNV NM\_000296.3:c.10532C>T:p.A3511V 6720.4 PASS 16 2147518 G A PKD1 Intron32 Intronic SNV NM\_000296.3:c.10218-14C>T 6194.41 PASS 16 2150323 / A G PKD1 Intron27 Intronic SNV NM\_000296.3:c.9569-13T>C 6960.57 PASS 16 2150489 GCT G PKD1 Exon27 Frameshift deletion NM\_000296.3:c.9474\_9475del: p.3158\_3159del 7103.23 PASS 16 2152129 / A G *PKD1* Exon26 Synonymous SNV NM\_000296.3:c.9330T>C:p.= 64581.14 PASS 16 2152387 / A G PKD1 Exon25 Nonsynonymous SNV NM\_000296.3:c.9196T>C:p.F3066L 49993.66 PASS 16 2152388 / C G *PKD1* Exon25 Synonymous SNV NM\_000296.3:c.9195G>C:p.= 50653.93 PASS<br>16 2152619 / C T *PKD1* Exon25 Synonymous SNV NM\_000296.3:c.8964G>A:p.= 7886.09 PASS 16 2152619 / C T PKD1 Exon25 Synonymous SNV NM\_000296.3:c.8964G>A:p.= 7886.09 PASS 16 2152651 / T C PKD1 Intron24 Intronic SNV NM\_000296.3:c.8949-17A>G 41146.96 PASS 16 2152847 / G A PKD1 Exon24 Synonymous SNV NM\_000296.3:c.8916C>T:p.= 7036.67 PASS 16 2153272 A See below\* PKD1 Exon23 Nonframeshift insertion See below\* 33209.17 PASS 16 2153618 / C T PKD1 Exon23 Nonsynonymous SNV NM\_000296.3:c.8440G>A:p.G2814R 3477.3 PASS 16 2153619 / G A *PKD1* Exon23 Synonymous SNV NM\_000296.3:c.8439C>T:p.= 4679.38 PASS 16 2153765 / G A PKD1 Exon23 Nonsynonymous SNV NM\_000296.3:c.8293C>T:p.R2765C 4200.12 PASS 16 2154537 / G A PKD1 Exon22 Nonsynonymous SNV NM\_000296.3:c.8123C>T:p.T2708M 3605.52 PASS 16 2154565 G A PKD1 Exon22 Stopgain SNV NM\_000296.3:c.8095C>T:p.Q2699X 3154.68 PASS 16 2155426 / T C PKD1 Exon21 Nonsynonymous SNV NM\_000296.3:c.7913A>G:p.H2638R 32433.16 PASS 16 2156021 / A G PKD1 Exon20 Synonymous SNV NM\_000296.3:c.7708T>C:p.= 45989.17 PASS 16 2156447 / G A PKD1 Exon18 Synonymous SNV NM\_000296.3:c.7441C>T:p.= 39665.05 PASS 16 2156623 G T PKD1 Exon18 Nonsynonymous SNV NM\_000296.3:c.7265C>A:p.T2422K 1634.58 PASS 16 2156850 / A G PKD1 Exon17 Synonymous SNV NM\_000296.3:c.7165T>C:p.= 90944.82 PASS 16 2158022 / G A PKD1 Exon16 Synonymous SNV NM\_000296.3:c.6927C>T:p.= 5649.07 PASS 16 2158570 / G A PKD1 Exon15 Nonsynonymous SNV NM\_000296.3:c.6598C>T:p.R2200C 28297.7 PASS 16 2158871 / C A PKD1 Exon15 Synonymous SNV NM\_000296.3:c.6297G>T:p.= 7173.93 PASS 16 2159313 C T PKD1 Exon15 Nonsynonymous SNV NM\_000296.3:c.5855G>A:p.G1952D 8717.56 PASS 16 2159321 / G A PKD1 Exon15 Synonymous SNV NM\_000296.3:c.5847C>T:p.= 3863.12 PASS 16 2159391 G A PKD1 Exon15 Nonsynonymous SNV NM\_000296.3:c.5777C>T:p.A1926V 2041.5 PASS 16 2159405 / C T *PKD1* Exon15 Synonymous SNV NM\_000296.3:c.5763G>A:p.= 6637.77 PASS 16 2159557 / C T PKD1 Exon15 Nonsynonymous SNV NM\_000296.3:c.5611G>A:p.A1871T 4010.9 PASS 16 2159996 / G A PKD1 Exon15 Synonymous SNV NM\_000296.3:c.5172C>T:p.= 47423.27 PASS 16 2160280 G A PKD1 Exon15 Stopgain SNV NM\_000296.3:c.4888C>T:p.Q1630X 6618.24 PASS 16 2160494 / C T *PKD1* Exon15 Synonymous SNV NM\_000296.3:c.4674G>A:p. = 19874.71 PASS 16 2160503 / T G *PKD1* Exon15 Synonymous SNV NM\_000296.3:c.4665A>C:p.= 49280.48 PASS<br>16 2160622 / C T *PKD1* Exon15 Nonsynonymous SNV NM\_000296.3:c.4546G>A:p.A1516T 3201.27 PASS 16 2160622 / C T PKD1 Exon15 Nonsynonymous SNV NM\_000296.3:c.4546G>A:p.A1516T 3201.27 PASS 16 2160673 / G A PKD1 Exon15 Synonymous SNV NM\_000296.3:c.4495C>T:p.= 3420.25 PASS 16 2160716 C T PKD1 Exon15 Synonymous SNV NM\_000296.3:c.4452G>A:p.= 3964.01 PASS 16 2160973 / A G PKD1 Exon15 Nonsynonymous SNV NM\_000296.3:c.T4195C:p.W1399R 32607.04 PASS 16 2161244 CTGCGT-GGGGA PKD1 Exon15 Frameshift deletion NM\_000296.3:c.3914\_3923del: p.1305\_1308del 7343.71 PASS 16 2161443 G A PKD1 Exon15 Nonsynonymous SNV NM\_000296.3:c.3725C>T:p.T1242M 3864.26 PASS 16 2161655 / G C PKD1 Exon15 Synonymous SNV NM\_000296.3:c.3513C>G:p.= 2905.22 PASS 16 2161793 / G A PKD1 Exon15 Synonymous SNV NM\_000296.3:c.3375C>T:p.= 33353.67 PASS 16 2161796 / G A PKD1 Exon15 Synonymous SNV NM\_000296.3:c.3372C>T:p.= 33778.82 PASS<br>16 2161874 T G PKD1 Intron14 Splicing SNV NM\_000296.3:c.3296-2A>C 3192.03 PASS 16 2161874 T G PKD1 Intron14 Splicing SNV NM\_000296.3:c.3296-2A>C 3192.03 PASS 16 2162361 / A G PKD1 Exon14 Nonsynonymous SNV NM\_000296.3:c.3275T>C:p.M1092T 31648.89 PASS 16 2162839 / T C PKD1 Exon13 Synonymous SNV NM\_000296.3:c.3111A>G:p. = 11160.46 PASS 16 2162887 / A G PKD1 Exon13 Synonymous SNV NM\_000296.3:c.3063T>C:p.= 22392.19 PASS 16 2164294 / G A PKD1 Exon11 Synonymous SNV NM\_000296.3:c.2730C>T:p.= 11471.01 PASS

(table continues)

Table 2 (continued)

Chromo-					Exon/				
some	Position	dbSNP ID	<b>REF</b>	ALT	Gene Intron	Function	Variant nomenclature	<b>QUAL</b>	<b>FILTER</b>
16	2164324		C	T	PKD1 Exon11	Synonymous SNV	NM_000296.3:c.2700G>A:p.=	11,448.82 PASS	
16	2164330		Τ	G	PKD1 Exon11	Synonymous SNV	NM 000296.3:c.2694A>C:p. =	4682.76 PASS	
16	2164808		C		PKD1 Exon11	Nonsynonymous SNV	NM 000296.3:c.2216G>A:p.R739Q	279070.57 PASS	
16	2165630			C	PKD1 Intron9	intronic SNV	NM 000296.3:c.1850-4A>G	50257.02 PASS	
16	2166061		Α		PKD1 Exon9	Nonsynonymous SNV	NM 000296.3:c.1781T>A:p.F594Y	4476.37 PASS	
16	2167874		G	A	PKD1 Exon5	Synonymous SNV	NM 000296.3:c.1119C>T:p. =	268925.84 PASS	
16	2167970		G	A	PKD1 Exon5	Synonymous SNV	NM 000296.3:c.1023C>T:p.=	12263.35 PASS	
16	2169178		C	A	PKD1 Exon3	Nonsynonymous SNV	NM 000296.3:c.296G>T:p.S99I	8791.34 PASS	
16	2185509		G	A	PKD1 Exon1		Nonsynonymous SNV NM 000296.3:c.182C>T:p.P61L	750.13 PASS	
16	2185584		G		PKD1 Exon1		Nonsynonymous SNV NM 000296.3:c.107C>A:p.P36H	127.59 PASS	
4		88928968 rs1805044	G	C	PKD2 Exon1		Nonsynonymous SNV NM 000297.3:c.83G>C:p.R28P	41620.06 PASS	
4	88929080		G	GGACC	PKD2 Exon1		Frameshift insertion NM 000297.3:c.195 196insGACC:	10644.57 PASS	
							p.R65fs		
4	88929082		A	AC	PKD2 Exon1		Frameshift insertion NM 000297.3:c.197 198insC:	4694.47 PASS	
							p.D66fs		
4		88929305 rs2728118	G	A	PKD2 Exon1	Synonymous SNV	NM 000297.3:c.420G>A:p.=	5295.98 PASS	
4		88929453 rs117078377 G		А	PKD2 Exon1	Nonsynonymous SNV	NM 000297.3:c.568G>A:p.A190T	4083.65 PASS	
4		88940594 rs62310565	C		PKD2 Intron1	Intronic SNV	NM 000297.3:c.596-16C>T	2722.03 PASS	
4	88959475		C		PKD2 Exon4	<b>Stopgain SNV</b>	NM 000297.3:c.916C > T:p.R306X	5216.94 PASS	
4	88959479		GT	G	PKD2 Exon4	<b>Frameshift deletion</b>	NM 000297.3:c.921delT:p.S307fs	10175.19 PASS	
4	88959517		C	Т	PKD2 Exon4	<b>Stopgain SNV</b>	NM 000297.3:c.958C > T:p.R320X	3946.43 PASS	
4	88959653		<b>CGTAA</b>	C	PKD2 Intron4	Splicing deletion	NM 000297.3:c.1094 + 1 1094 + 4del	8740.89 PASS	
4	88964610		G	Α	PKD2 Intron5	<b>Splicing SNV</b>	NM 000297.3:c.1319 + 1G > A	8073.4 PASS	
4		88967919 rs75762896		G	PKD2 Exon6	Nonsynonymous SNV	NM 000297.3:c.1445T>G:p.F482C	6455.92 PASS	
4	88977424		G	А	PKD2 Intron8	Intronic SNV	NM 000297.3:c.1898+5G>A	7426.45 PASS	
4	88996055		C	т	PKD2 Exon14	<b>Stopgain SNV</b>	NM 000297.3:c.2614C > T:p.R872X	3914.06 PASS	

Pathogenic mutations are denoted in bold.

\*AGCAGCGTATAGTTGAGCTGCAGAT; variant nomenclature, NM\_000296.3:c.8786\_8787insATCTGCAGCTCAACTATACGCTGC:p.L2929delinsHLQLNYTLL.

REF, reference; /, there was entry in dbSNP but was removed because it was located in PKD1 duplicated region thus could be contamination from pseudogenes.

which could have led to inaccurate ALT frequency estimation. The 14 remaining low ALT percentage variants had coverage similar to the other variants and were spread across six distinct patients. Three low ALT percentage variants were repeatedly found in four patients. These three variants are known single nucleotide polymorphisms (SNPs) (rs10960, rs3087632, and rs7203729) and are found in other patients at frequencies in the 40% to 60% or >90% ALT allele frequency range. All three variants are within 700 bp of each other on chromosome 16 (positions 2140010, 2140454, and 2140680). Visual inspection of these low ALT percentage variants did not reveal any sequence artifacts; eg, the regions around these SNPs were neither GC poor nor GC rich, suggesting preferential amplification of the normal allele during LR-PCR. A detailed list of all PKD1 and PKD2 genetic variations identified in this study and an assessment of the pathogenic potential of missense variants in ANNOVAR software are shown in [Tables 2](#page-6-0) and [3,](#page-8-0) respectively. Of these 250 variants, 221 (88.4%) were in PKD1 and 29 (11.6%) were in PKD2, and 16 variants were pathogenic [\(Table 2\)](#page-6-0). The analytic sensitivity and specificity were calculated for 2075 sites in aggregate across the 25 samples (corresponding to 83 target locations in 25 patients), including 250 variants and 1825 normal alleles, that matched the reference genes. The sensitivity of the NGS method was 99.2% (95% CI,  $96.8\% - 99.9\%$  and the specificity was  $99.9\%$  (95% CI,  $99.7\% - 100.0\%$  compared with Sanger sequencing results [\(Table 4\)](#page-8-1). Taken together, these results suggest that pooling 25

bar-coded samples in a single Illumina run is feasible, with an expected read depth of approximately 300-fold.

## Mutation Analyses of Pathogenic Mutation-Negative and Novel Patients with ADPKD by Bar-Coded and Multiplexed NGS

Based on these proof-of-principle results, we analyzed an additional 24 ADPKD cases that tested negative for a pathogenic mutation by Sanger sequencing. The NGS method identified *PKD1* pathogenic variants in three patients for whom variants were not previously detected (NM\_000296.3:c.3296- 2A>T; NM\_000296.3:c. 7288 C>T:p.R2430X; and NM\_000296.3:c. 1937 G>A:p.W646X), which were then further confirmed by Sanger sequencing. One of these variants, NM 000296.3:c.3296-2A>T, was previously missed because of a technologist's error, whereas the other two were mainly due to allele dropout during the LR-PCR step. Careful analysis of the original Sanger sequencing data demonstrated very low signal  $\left($  <10% to 20%) for the mutant alleles, leading to miscalled sequences.

To further evaluate the sensitivity and specificity of the NGS assay, we analyzed an additional cohort of 25 patients with ADPKD that had not been previously genotyped. Of the 25 patients, 16 (64%) had a pathogenic or probably pathogenic mutation, whereas no mutations were identified in the remainder of the patient cohort [\(Table 5\)](#page-9-0). All the positive

<span id="page-8-0"></span>



B, benign; D, deleterious; N, neutral; NA, not available; NE, neutral (sequence changes scored as benign by all three software applications<sup>18</sup>); P, possibly damaging; PP, probably pathogenic (sequence changes scored as deleterious by all three computational analysis tools<sup>18</sup>); PN, probably neutral (sequence changes scored as benign by only one or two of the software applications<sup>18</sup>); T, tolerant.

results and the mutation-negative cases were confirmed by Sanger sequencing, suggesting sensitivity and specificity of 100% for detecting ADPKD mutations in this sample.

## NGS Cost Analysis

We also evaluated the costs of reagents and sequencing for the NGS-based approach. By pooling 25 patient samples in a single NGS Illumina MiSeq run, the cost of the test was reduced by approximately 70% compared with Sanger sequencing, from approximately \$271 per patient to approximately \$82 per patient [\(Table 6\)](#page-9-1). Moreover, although the hands-on time required for setting up the LR-PCR reactions, preparing the library, and sequencing still requires approximately 1 week, data analysis is considerably faster with NGS than with the Sanger method and can be completed in only a few hours. Therefore, a 25-patient cohort could be analyzed in 1 to 2 weeks compared with  $\geq$  4 weeks with the Sanger method.

# **Discussion**

NGS technology has revolutionized genomic and genetic research and the field of clinical genomics. Sample bar

coding and multiplexing capabilities and the availability of simpler workflows and faster turnaround time instruments, such as Illumina MiSeq, have made this method attractive to clinical laboratories. Rossetti et al<sup>[17](#page-11-13)</sup> recently developed an original approach for PKD gene mutation detection in large cohorts by coupling LR-PCR with NGS analysis with sensitivity of 78% and specificity of 100%. Herein, we describe a new NGS PKD genotyping approach with analytical sensitivity of 99.2% and specificity of 99.9% compared with the Sanger sequencing method. This

<span id="page-8-1"></span>Table 4 NGS Analytic Sensitivity and Specificity (Variants Detection)

		Sanger sequencing					
NGS	Variant alleles (positive)	Reference alleles (negative)	Total				
Variant alleles (positive)	248		248				
Reference alleles (negative)	2	1825	1827				
Total	250	1825	2075				

Compared with the Sanger sequencing assay: sensitivity  $= 99.2\%$  (95%) CI, 96.8%-99.9%); specificity = 99.9% (95% CI, 99.7%-100.0%).

<span id="page-9-0"></span>Table 5 Details of PKD1 and PKD2 Mutations in a Cohort of 25 Novel Patients

No.	Chr.	Position	<b>REF</b>	ALT	Exon	Gene	Exonic function	Amino acid change	<b>QUAL</b>	FILTER
1	16	2141440	CAGCG	C	42	PKD1	Frameshift deletion	NM 000296.3:c.11690 11693del:	11,229.66	<b>PASS</b>
								p.3897 3898del		
$\mathcal{P}$	16	2157900	CT.		16	PKD1	Frameshift deletion	NM 000296.3:c.7049delA:p.E2350fs	16754.66	<b>PASS</b>
3	16	2144151	GCCCCA-	G	35	PKD1	Frameshift deletion	NM 000296.3:c.10548 10557del:	32720.66	<b>PASS</b>
			<b>GCTCC</b>					p.3516_3519del		
4	16	2168287	G	A	5	PKD1	Stopgain SNV	NM_000296.3:c. 706C >T:p.0236X	6574.71	<b>PASS</b>
5	16	2164185	G	Α	11	PKD1	Stopgain SNV	NM 000296.3:c. 2839 C>T:p.0947X	9480.71	<b>PASS</b>
6	16	2156600	G	A	18	PKD1	Stopgain SNV	NM 000296.3:c. 7288 C>T:p.R2430X	4314.5	<b>PASS</b>
7	16	2140782	G	A	44	PKD1	Stopgain SNV	NM 000296.3:c. 12028 C>T:p.04010X	13180.82	<b>PASS</b>
8	16	2160674	G		15	PKD1	Stopgain SNV	NM 000296.3:c. 4494 C>A:p.Y1498X	9530.5	<b>PASS</b>
9	16	2166531	-Т	A	8	PKD1	Nonsynonymous SNV* <sup>1</sup>	NM 000296.3:c. 1721 A>T:p.E574V	6856.71	<b>PASS</b>
10	16	2156912	A	G	17	PKD1	Nonsynonymous SNV*	NM 000296.3:c. 7103 T>C:p.L2368S	16,133.71	<b>PASS</b>
11	16	2164844	A	G.	11	PKD1	Nonsynonymous SNV*	NM 000296.3:c. 2180 T>C:p.L727P	7176.71	<b>PASS</b>
12	4	88929082	A	AC	1	PKD2	Frameshift insertion	NM_000297.3:c.197_198insC:p.D66fs	10197.45	<b>PASS</b>
13	4	88959475	C		4	PKD2	Stopgain SNV	NM 000297.3:c. 916 C>T:p.R306X	11,046.71	<b>PASS</b>
14	4	88959517	ſ		4	PKD2	Stopgain SNV	NM 000297.3:c. 958 C>T:p.R320X	18,191.71	<b>PASS</b>
15	4	88929145	G	А	$\mathbf{1}$	PKD2	Stopgain SNV	NM_000297.3:c. 260 G>A:p.W87X	4583.71	<b>PASS</b>
16	4	88959536		G	4	PKD2	*Nonsynonymous SNV	NM 000297.3:c. 977 T>G:p.V326G	11,941.71	<b>PASS</b>

\*Classified as probably pathogenic based on SIFT, Polyphen-2, and MutationTaster predictions as specified in Materials and Methods. <sup>†</sup>Predicted to affect exon splicing by computational analysis by distrusting an exonic splice enhancer.

Chr, chromosome; REF, reference.

approach is based on LR-PCR amplification of both the PKD1 and PKD2 genes using 10 pairs of carefully designed PCR primers covering approximately 68.0 kb of PKD genomic region, corresponding to 31.9 kb (68.8%) and 35.8 kb  $(51.0\%)$  of the *PKD1* and *PKD2* genomic regions, respectively, particularly tailored to relatively small cohorts and clinical diagnostic applications. This improvement in sensitivity is mainly due to two factors. First, we individually bar coded LR-PCR products by patient rather than pooling of DNA samples or LR-PCR amplicons from different patients before sample bar coding.<sup>[17](#page-11-13)</sup> In contrast, Rossetti et al<sup>17</sup> pooled DNA samples or PCR products before library generation, leading to a substantial loss of sensitivity and specificity due primarily to lack of coverage. The strategy used in the present study allows for improved coverage of individual patient samples by increasing read depth and decreasing background noise, thus allowing variant calls with high confidence. Second, we used longer reads on the MiSeq platform (150 bp  $\times$  2 as opposed to 101 bp/75 bp  $\times$  2) compared with Rossetti et al, $17$  ensuring higher genome mapping accuracy by reducing mapping errors.

We used the GATK software package to refine the BAM (Binary Alignment/Map) file generated by the BWA program; this step can improve accuracy in variant calls,

<span id="page-9-1"></span>Table 6 Comparison of Reagents, Sequencing Costs, and Time of Labor for Sanger Sequencing and NGS

			$Cost($ \$)			Labor time	
Method	Purpose	Quantity	Per sample	Per run	Per subject	(days)	
Sanger sequencing ( $N = 25$ )	LR-PCR (PKD1)	250	2.40	600.00	24.00	5	
	Standard PCR (PKD2)	400	1.50	600.00	24.00	4	
	Purification	200	2.40	480.00	19.20		
	Sequencing primers	3050	0.10	305.00	12.20	<b>NA</b>	
	Sanger sequencing	1600	3.00	4800.00	192.00	5	
	Data analysis	ΝA	NA	NA	NA	4	
	Total			6785.00	271.40	19	
$NGS (N = 25)$	LR-PCR (PKD1 and PKD2)	250	1.45	362.50	14.50	$\mathbf{2}$	
	LR-PCR product quantification	250	0.12	30.00	1.20	0.5	
	DNA fragmentation	25	6.50	162.50	6.50	0.5	
	Library preparation	25	20.00	500.00	20.00	3	
	Library quality assessment	25	0.20	5.00	0.20	0.25	
	NGS sequencing (MiSeg)		990.00	990.00	39.60	1	
	Data analysis	ΝA	NA	NA	NA	1	
	Total			2050.00	82.00	8.25	

NA, not applicable.

particularly for indels. Variant calling of NGS data is prone to a high error rate owing to the following factors: many reads spanning insertion/deletion sites are misaligned because each read is aligned independently, and the raw base quality scores often vary with instrument features, such as the platform used, machine cycle, and sequence context, and, thus, cannot reflect the true base calling error rates.<sup>[25](#page-12-7)</sup> These errors in alignments and base calling will be translated into variant and genotype inference, leading to false sequence calls. The local realignment around indels and base quality score recalibration function in the GATK package can decrease the false-positive calls around indels, increasing base quality at the end of the reads and enabling overall higher accuracy of the sequence data.<sup>[25](#page-12-7)</sup> Furthermore, the multiple sample-calling feature of GATK enabled processing of multiple samples simultaneously, allowing the use of sequencing information across all samples, further increasing the accuracy of variant call. Liu et  $al^{28}$  $al^{28}$  $al^{28}$  conducted a systematic assessment of several variant calling packages and found that GATK in combination with the BWA aligner performed better compared with other software applications for high coverage of Illumina data  $(20\times)$ . The present NGS data had average coverage of  $103\times$ , far above the threshold, making it suitable for these analyses.

The alignment algorithm in the analysis pipeline, BWA, is a fast and memory-efficient short read aligner, $^{23}$  allowing implementation on a standard desktop computer without the need for expensive computer clusters and making it attractive to the standard diagnostic laboratory. In our experience, data from 25 patients could be efficiently analyzed (within several hours) using an iMac desktop computer with two processors and a 3.06-GHz CPU and 16 GB of memory (Apple Inc., Cupertino, CA). The data analysis pipelines have been fully automated with Unix shell scripts, significantly reducing the hands-on time required for quality checks of the sequencing data. This is a major improvement compared with the labor-intensive pipeline required for analyzing Sanger sequencing data, even when using automated applications, such as Mutation Surveyor (SoftGenetics LLC., State College, PA $,$ <sup>[13](#page-11-14)</sup> for variant calling. Moreover, ANNOVAR genomic annotator can readily access several prediction programs, including  $SIFT<sub>1</sub><sup>29</sup> Poly SIFT<sub>1</sub><sup>29</sup> Poly SIFT<sub>1</sub><sup>29</sup> Poly-$ Phen-2,<sup>[30](#page-12-12)</sup> and Mutation Taster ([http://www.mutationtaster.](http://www.mutationtaster.org) [org](http://www.mutationtaster.org), last accessed October 25, 2013), used for evaluating the pathogenic potential of missense change, providing important information about the pathogenicity of the variants analyzed. In this study, of 27 missense variants, six were classified as deleterious by all three prediction algorithms, which is in agreement with the results obtained by the present standard bioinformatics procedures ([Table 3](#page-8-0)).<sup>[18](#page-12-0)</sup>

Taken together, the workflow reported herein can be easily adapted to a routine clinical diagnostic setting. The LR-PCR and library preparation steps have been automated using a liquid handler (Corbett 1200; Qiagen Inc.), standardizing the reaction setup process. Similarly, the individual bar coding of patient samples and the simultaneous processing of 25 samples, together with the automated data analysis pipeline, have greatly reduced the number of test reactions, decreasing technologist's errors and increasing the overall precision and accuracy of the sequencing data obtained. Consequently, up to 25 patients can be genotyped in 1 to 2 weeks at reagent costs of \$82 per patient compared with \$271 per patient with the current Sanger sequencing method.

Overall, the present method detected all 250 Sanger sequencing-verified gene variations, including single nucleotide changes, splice site alterations, and indel mutations, except for two PKD1 changes residing in the same amplicon that were ascertained as homozygous by NGS rather than as heterozygous. In contrast, of the 24 patients with Sanger sequencing-negative ADPKD, 3 were found to harbor a pathogenic mutation in PKD1 by the NGS method, subsequently confirmed by Sanger sequencing, using different primers. Except for PKD1 c.3296-2A>T, previously missed by Sanger sequencing owing a technologist's error, the two other discrepancies were due to allele dropout during the LR-PCR amplification step. Allele dropout or reduction to homozygosity has been well documented, particularly for PKD1, which is highly polymorphic, and it is likely due to the presence of an SNP in the primer binding sites in one of the two alleles, leading to unequal PCR amplification of the two heterozygous alleles. $17,18$  This phenomenon is less likely to occur with NGS because deep sequencing has a significantly higher level of analytical sensitivity of at least  $5\%^{32,33}$  $5\%^{32,33}$  $5\%^{32,33}$  compared with the Sanger method for detection of mutations in impure populations of DNAs. Preferential amplification of one allele versus the other can also explain the lower-thanexpected (50%) percentage ALT alleles observed for approximately 10% of the variants in this study. In addition, NGS requires only a limited number of primer pairs, as opposed to >80 pairs with Sanger sequencing, thereby considerably reducing the chances for mispriming. Nevertheless, in all cases with homozygous mutations, subsequent confirmatory sequencing analysis must be performed to rule out false-positive results.<sup>[18](#page-12-0)</sup> Note that the greater analytical sensitivity achieved by high-depth sequencing can be particularly suitable for detecting low-abundance mutations in rare cases of mosaicism. Although falsepositive results have not been seen in this study, we propose that as a part of a routine clinical workflow, all

<span id="page-10-0"></span>

Figure 6 Coverage plot illustrating the identification of a large-sized deletion in PKD2. The patient had an approximately 6-kb deletion that included PKD2 exon (Ex) 5 and adjacent intronic regions compared with the control sample.

mutations should be confirmed by Sanger sequencing. The low coverage of the GC-rich exon 1 found in this study for multiple samples may lead to false-negative results. To overcome this problem, we suggest that follow-up Sanger sequencing be used as an alternative method for negative cases with low coverage  $(<5\times$ ).<sup>[34](#page-12-15)</sup>

One potential limitation of this NGS-based ADPKD genotyping approach is that the target enrichment process still requires LR-PCR, and setting up LR-PCR is cumbersome and complicated, especially when large numbers of samples are analyzed. Qi et al $^{35}$  used hybridization-based exon capture as an approach to ADPKD genotyping. However, although target enrichment is considerably easier to perform compared with LR-PCR, this approach is not suitable for distinguishing PKD1 from the pseudogenes, with a true-positive mutation detection rate of only  $28.6\%$ .<sup>[35](#page-12-16)</sup> Low coverage of GC-rich DNA regions due to the unexpected secondary structure of the DNA template may also be a limitation and an underestimated cause for missed variants, particularly in exon 1 of *PKD1*, which is 85% GC rich.<sup>17,36</sup> This phenomenon of base composition bias has been well documented for Illumina sequencing and is primarily attributed to the enrichment PCR step during library construction. $36$  Amplification with Accu-Prime Taq high fidelity enzyme blend at a low primer extension temperature of  $65^{\circ}$ C has been shown to improve the overall coverage of high $-GC$ -rich areas.<sup>36</sup> In our hands, there was still very good average read coverage of PKD1 exon 1  $(15\times)$ , allowing for confident variant calling. However, we identified a 156-bp-long region in exon 1 (chr16:2185623- 2185778) in which we observed  $\langle 5 \times \rangle$  coverage at one nucleotide or more and in at least one patient in the cohort. Unequal and sometimes low coverage in this region indicates that variants occurring in this region might be missed, suggesting that this amplicon should be added in an excess molar ratio compared with all other amplicons when pooling to provide sufficient read depth for a confident mutation call.<sup>[17](#page-11-13)</sup> We note, however, that Sanger sequencing did not detect any variants in this region in the present cohort despite the high quality of the Sanger traces (not shown).

Finally, large deletions have been shown to play an important role in ADPKD in  $1\%$  to  $3\%$  of cases.<sup>[37,38](#page-12-18)</sup> Although the paired-end mapping feature in the genotyping protocol makes it possible to detect such mutations, it requires that the deletion is located in the LR-PCR amplicon [\(Figure 6](#page-10-0)). The method will not detect any deletion that is outside the LR-PCR primer range, requiring the continuing need for methods such as multiplex ligation-dependent probe amplification. $38$ 

In summary, NGS-based ADPKD genetic analysis is a highly accurate and reliable approach for mutation analysis, achieving high sensitivity and improved intronic coverage with a faster turnaround time and lower cost. Optimization of the workflow and the stepwise process quality control metrics for data analysis will likely become routine for clinical genetic testing, and NGS would be an appropriate new standard for clinical genetic testing of ADPKD.

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## Supplemental Data

Supplemental material for this article can be found at <http://dx.doi.org/10.1016/j.jmoldx.2013.10.005>.

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