

Long-read sequencing in fungal identification

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### ABSTRACT

Long-read sequencing is currently supported by sequencing platforms from Pacific Biosciences and Oxford Nanopore Technologies, both of which generate ultra-long reads. Metabarcoding and metagenomics are the two approaches used when implementing sequencing. Metabarcoding involves the amplification and sequencing of selected nucleic acid regions, while in a metagenomic approach extracted nucleic acids are sequenced directly without prior amplification. Both approaches have associated advantages and disadvantages, which, in combination with longread sequencing, provide a promising new approach for fungal identification and diagnosis of mycoses, on which we will reflect in this short review.

**Keywords:** diagnostics, DNA barcoding, fungal identification, long-read sequencing, metabarcoding, metagenomics, mycoses, next generation sequencing.

## Long-read sequencing

Long-read sequencing technologies are characterised by the potential to generate ultralong reads over 10 kb in one run.<sup>1</sup> Pacific Biosciences (PacBio) first released their longread sequencing instrument in 2011 and most recently released the Sequel IIe (Fig. 1).<sup>2</sup> PacBio sequencing is based on the conversion of fluorescent signals produced when nucleotides are bound to a template strand via a polymerase. The template doublestranded DNA has two hairpin adaptors bound to each end and so sequencing continues around the template for the duration of the polymerase lifetime. PacBio sequencing has achieved high accuracy, which is reported to be 99.8%, and produces a high throughput with parallel sequencing of millions of template strands.<sup>3</sup> However, PacBio sequencing is a trade-off between read length and read quality: as longer template strands are sequenced, there is often a less accurate consensus sequence. Additionally, library preparation is estimated to be 1 day, which may not be suitable for time sensitive applications. Oxford Nanopore Technologies (ONT) began commercial release in 2015 with their MinION sequencer and has since released instruments and flow cells for a variety of throughput requirements (Fig. 2).<sup>4</sup> The basis of ONT sequencers are biological nanopores fixed in membranes, of which nucleotide strands travel through to cause a current change, which is then translated into a sequence. ONT sequencing read length is only limited by sample DNA length, quantity, and purity and as they provide a wide array of library preparation kits and throughput options it can be scaled to any potential use intended. Additionally, the low initial investment and small portable size of some ONT sequencers allow sequencing to be performed in locations outside the laboratory.<sup>2</sup> The major drawback of ONT is the lower read accuracy reported, although computation intensive bioinformatic tools are available to increase accuracy to 99%.<sup>5</sup> Samples that result in low DNA quantity, quality, and short read lengths do not take full advantage of ONT sequencing and impede sequencing by blocking and inactivating pores. These sequencing technologies are further discussed in other studies.<sup>2</sup>

Studies using PacBio and ONT long-read sequencers to sequence and identify fungal species using metabarcoding and metagenomic approaches are described below to demonstrate the potential use for long-read sequencers in fungal identification.

# Metabarcoding

Metabarcoding involves the sequencing of targeted nucleic acid regions within environmental and clinical samples. This approach combines DNA barcoding with high throughput sequencing of specific taxonomic regions (barcodes). These barcodes, which have



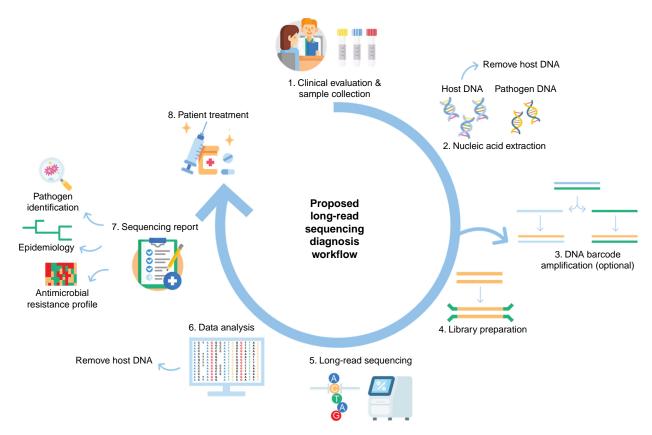
**Fig. 1.** Pacific Biosciences Long Read Sequencing Platforms. The first commercial long read sequencer Sequel was released in 2015, supporting the SMRT Cell I M. The newer instruments Sequel II and Sequel IIe support the SMRT Cell 8 M, capable of simultaneous sequencing of 8 million template DNA strands. The Sequel IIe improves upon the previous iterations through software upgrades resulting in a reduction in analysis, file transfer and data storage requirements. Instrument pictures from the manufacturer's webpage (https://www.pacb.com/).



**Fig. 2.** Oxford Nanopore Long Read Sequencing Platforms. The flagship product, the MinION, is a palm-sized device supporting MinION flow cells containing 4 × 125 nanopore channels. GridION and PromethION are the higher throughput instruments, supporting 5 and 48 flow cells respectively. The Flongle flow cell contains 126 nanopore channels and is compatible with the MinION and GridION. A flow cell for the PromethION containing 2675 nanopore channels is also commercially available. Instrument pictures from the manufacturer's webpage (https://nanoporetech.com/).

high taxonomic coverage and high resolution, are amplified and sequenced (Fig. 3).<sup>6</sup> The generated barcode sequences are clustered into operational taxonomic units (OTUs) based on sequence similarity and compared against databases containing reference barcode sequences to provide an accurate representation of the microbial population. The advantages of this approach are the low level of genomic material required and faster and less complex computational analysis. However, as only specific regions are sequenced, information is limited to identification, although this may not be an issue for all studies. Prior amplification of a sample also potentially introduces bias, which may result in the inaccurate representation of the microbial community.<sup>6</sup> Previous microbial metabarcoding studies with short-read sequencing technologies used micro-barcodes that spanned less than 600 bp, which were often shorter than the fulllength barcoding regions.<sup>7</sup> Long-read sequencers can span beyond the full-length barcode regions and resolve longer structural variations that are challenging for short-read sequencers, leading to higher discriminatory power.

Long-read fungal metabarcoding studies primarily use the full-length internal transcribed spacer (ITS) region of the rRNA gene cluster to identify fungal species, although shorter barcode regions are also used. To validate the ability of longread sequencers to identify fungal species, ONT and PacBio have been used to identify members of mock fungal communities. The full-length ITS and the ITS1 regions were shown to accurately identify 16 and 26 fungal species within mock communities respectively using PacBio sequencing.<sup>8,9</sup> The full-length ITS region in conjunction with ONT sequencing has also successfully identified fungal species in mock communities.<sup>10,11</sup> The ITS region was found to be the superior locus for fungal identification in nanopore sequencing although, in a mock community with varying abundance of 16 fungal species, species level identification was only achieved for 1/3 of fungal species.<sup>7</sup> Metabarcoding of clinical samples with nanopore sequencing of the ITS region, has been explored extensively. Pathogens were identified from nine positive blood culture bottles which were then verified by routine diagnosis, one of which was a Candida albicans infection.<sup>5</sup> Type strains of five *Candida* species were also identified to sufficient (100–200  $\times$ ) coverage and nanopore sequencing errors did not affect correct species identification.<sup>5</sup> Full-length ITS nanopore sequencing has also identified potential pathogens in patient samples previously negative by traditional diagnostic methods.<sup>11,12</sup> PacBio has also been used in the clinical space to characterise the gut mycobiome of 14 healthy individuals with the ITS1 locus.<sup>9</sup> PacBio sequencing has primarily been applied to metabarcoding of environmental samples and has been demonstrated to outperform nanopore sequencing in such applications due to nanopore sequencing errors.<sup>13</sup> Metabarcoding of samples, such as tree roots,<sup>14</sup> soil,<sup>13</sup> mangrove sediments,<sup>15</sup> and lake water,<sup>7</sup> have revealed the potential of PacBio targeting the full-length ITS region to be used in broad ecological studies requiring accurate characterisation of the mycobiome of complex environmental samples. Metabarcoding of fungi using long-read sequencing has been established to be a promising avenue for the identification and characterisation of fungal species in clinical and environmental samples.



**Fig. 3.** Proposed Long-read Sequencing Diagnosis Workflow. Diagnosis of fungal infections would begin with clinical evaluation and patient sample collection. Nucleic acids would then be extracted from patient samples containing both host and pathogen DNA. Additional removal of host DNA may occur at this stage, and/or in metabarcoding studies. This is followed by DNA barcode amplification. In both metagenomic and metabarcoding studies, library preparation takes place before sequencing with long-read sequencers. Analysis of sequencing data would then be performed to generate a sequencing report which may include pathogen identification, epidemiological information, or an antimicrobial resistance marker (specific known mutations that confer resistance) maybe identified during metagenomic sequencing. This information in conjunction with the clinical evaluation then provides a diagnosis from which a treatment plan for the patient can be developed. Icons made by https://www.flaticon.com/authors/freepik.

# **Metagenomics**

Metagenomic sequencing, also known as shotgun sequencing, aims to sequence all genetic material within a sample. In this approach, all genetic material (DNA or RNA) is extracted from the primary samples, which are then fragmented and undergo library preparation to suit the sequencing technology. The sequencing library then undergoes in-depth sequencing and data analysis (Fig. 3).<sup>16</sup> An advantage of metagenomics over metabarcoding is higher resolution, as more parts of the genomes of every organism in the sample are sequenced, potentially generating information beyond identification, such as antimicrobial resistance and virulence. The direct sequencing of genetic material eliminates the need for prior culturing and amplification, reducing the time from sample collection to identification, eliminating any bias that may occur due to these additional steps, resulting in a more accurate representation of the community composition.<sup>17</sup> In metagenomic sequencing studies, the overwhelming amount of background DNA compared to microbial DNA remains a challenge and methods to enrich microbial DNA have been developed.<sup>18</sup> Additionally, the cost and bioinformatic requirements of metagenomic sequencing is generally higher than those of metabarcoding studies. For full use of metagenomic sequencing reads, robust reference whole genome sequences are required. Long-reads generated in metagenomic studies are more correctly mapped to reference genomes and give high discriminatory power for accurate identification. However, the main current hurdles for long-read metagenomics based fungal identification are the fact that current genome databases lack adequate coverage for all fungal species.<sup>19</sup>

Metagenomic studies with long-read sequencers to identify fungal species are currently limited. However, preliminary studies have demonstrated their promising potential. PacBio sequencing of skin samples using a metagenomic approach identified a similar microbial community to short-read sequencing.<sup>20</sup> Additionally, metagenomic PacBio sequencing has been used in conjunction with short-read sequencing for genome assembly of fungal species in complex lichen samples.<sup>21,22</sup> Metagenomic nanopore sequencing identified pathogens from 87 patient samples in a single hospital study from a range of infections, including fungal infections, achieving sensitivity and specificity of 90.9 and 100% respectively, outperforming short-read sequencing.<sup>23</sup> The same approach was applied to three patient samples positive for Pneumocystis jirovecii and three negative respiratory samples.<sup>19</sup> All positive samples returned reads identified as P. jirovecii. However, P. jirovecii was also detected in negative samples. Furthermore, fungal species were identified that are geographically restricted to areas that did not align with the patient's travel histories. These likely misidentifications were attributed to issues applying the bioinformatics tools to fungal identification. Additionally, all samples reported 77-95% Homo sapiens reads aside from one outlier (10%) demonstrating the high abundance of human background DNA.<sup>19</sup> Studies involving methods to overcome the limitations of metagenomic sequencing have emerged. The combination of metagenomic sequencing and whole genome amplification has been utilised to increase DNA quantity whilst maintaining the community composition to characterise the microbiome on the surface of oil paintings.<sup>24</sup> A method to deplete human DNA in clinical samples has been applied to respiratory samples and confirmed an Aspergillus infection previously diagnosed by culturing.<sup>25</sup> Additionally, this method also identified fungemia caused by Candida glabrata within 24 h whilst an extended culturing time (48-72 h to actionable results) was required for traditional identification.<sup>25</sup> Although there are currently drawbacks, with methods to overcome its limitations, longread metagenomics is a favourable prospect for fungal identification.

# Conclusion

Sequencing of genetic material has taken a significant step forward with the release of PacBio and ONT long-read sequencers. Their initial applications to fungal identification have indicated the promising potential for routine use in clinical diagnostics, microbiome characterisation, whole genome assembly and more, if the limiting factors of DNA extraction, low fungal-human sample DNA range, lack of reference sequences (DNA barcodes and whole genomes), and lack of bioinformatic tools, can be overcome. Implementation of long-read sequencing to diagnosis of fungal infections additionally requires a standardised workflow (Fig. 3). If successfully introduced into routine diagnosis of fungal infections it would drastically reduce turnaround time, from currently several days/weeks to less than 24 h (Fig. 3), enabling a timely and accurate induction of antifungal treatment, reducing mortalities, treatment and hospitalisation costs.

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