

# Next generation sequencing (NGS) in oncology: lights and shadows

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## Abstract

Advances in tumor genome sequencing using *next generation sequencing* (NGS) technologies have facilitated a greater understanding of the genetic abnormalities involved in cancer development and progression, dramatically changing oncology research. There are several different types of NGS technologies. *Whole genome sequencing* (WGS) determines the sequence of the complete genome, providing information on both coding and non-coding regions and structural variants. However, use is limited by the large volume of data generated, and associated time and resource costs. *Whole exome sequencing* (WES) determines the sequence of coding regions only, making it faster and cheaper than WGS, and the functional consequences of variants are easier to interpret. However, all variations in non-coding regions are missed. WGS and WES are often used together to maximize detection of variants. A less costly approach is the use of targeted sequencing, which focuses on particular regions of interest, based on their biological relevance. NGS technologies can also be used to sequence RNA, referred to as *RNA-Seq*. All these NGS technologies, individually or in combination, have a number of potential applications, including identification of biomarkers, and development of diagnostic and therapeutic strategies. However, although advances have been made, there are a number of limitations to be overcome before NGS technologies are routinely applied in both research and clinical practice.

**Key words:** cancer, DNA, molecular biology, mutations, next generation sequencing, research, RNA

## Introduction

Cancer is a biologically complex disease, with characteristics acquired during the course of a multistep development process that allow cancer cells to survive, proliferate and disseminate by sustaining proliferative signaling, evading growth suppressors, resisting cell death, enabling replicative immortality, inducing angiogenesis, activating invasion and metastasis, deregulating cellular metabolism and evading the immune system [1]. Underlying all these features is instability in the tumor genome that defines the molecular fingerprint of each cancer type [2].

In this landscape, advances in tumor genome sequencing using *next generation sequencing* (NGS) technologies have dramatically changed oncology research, leading

to a deeper understanding of most genetic abnormalities involved in cancer development and progression [3]. In the last decade, many NGS-based studies have provided a comprehensive molecular picture of several types of cancer, and have led to the identification of a large number of new genomic, transcriptomic and epigenomic alterations, expanding knowledge about complexity, heterogeneity and evolution of the neoplastic disease process [4-15].

NGS technologies offer different applications depending on the aim of the research, the type of material to be sequenced, the coverage, and finally the speed and cost of sequencing [16, 17]. *Whole genome sequencing* (WGS) determines the sequence of the complete genome, providing information on both coding and non-coding regions and structural variants. However, interpretation of the data generated is difficult due to large volume of information generated, meaning that this approach can be time consuming and expensive. Moreover, some variants can be missed because of variation in coverage across the genome. In contrast, *whole exome sequencing* (WES) determines the sequence of coding regions only, making it faster and cheaper than WGS, and the functional consequences of variants are easier to interpret. However, all variations in non-coding regions are missed. Therefore, both WGS and WES are frequently performed together in order to detect

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as many variants as possible. Finally, targeted sequencing determines the sequence of specific genes or parts of genes, focusing on particular regions of interest, selected according to their biological relevance. This approach is usually less costly than the others (although total cost depends on the size of the gene panel), has a wide sequence coverage and is preferred for a clinical application. *NGS* technologies can also be used to sequence RNA, referred to as *RNA-Seq*, providing data on gene expression, novel cryptic translocations or gene fusions [18-21]. Thus, the integrated analysis of *WGS* and *RNA-Seq* can facilitate the interpretation of a large number of genomic alterations detected in the cancer genome, and can increase mutation detection performance, especially for low purity tumors [22-24]. In addition to gene expression and fusions, *RNA-Seq* can provide a broader profile of all tumor transcriptome, including noncoding RNAs, such as microRNAs (miRNAs), small interfering RNAs, ribosomal RNAs, small nucleolar RNAs and long noncoding RNAs, that represent more than half of the cancer transcriptome and play an important and growing role in multiple biological and pathological cellular processes [25-28].

All these tumor genome sequencing assays, individually or in combination with each other, have a number of potential applications. This includes the identification of clinically useful prognostic and predictive biomarkers, and the development of increasingly precise diagnostics and targeted therapeutics for application in personalized medicine, driven by the molecular profile of each individual disease and patient [29].

However, despite the rapid progression of *NGS*-technologies and their interesting different applications, several challenges remain before these can be incorporated into clinical practice. Firstly, *NGS* generates a huge amount of data that are not always easy to interpret. Sophisticated and expensive software, as well as bioinformatics algorithms, are required for the functional naming of each genomic alteration, but the reproducibility and accessibility of these algorithms still needs to be enhanced to allow the output data to be presented in a transparent, reproducible and understandable manner [30]. Moreover, overall tumor complexity makes the interpretation of sequencing output data even more difficult. In particular, intratumor heterogeneity can result in underestimation of the tumor genomics landscape based on data from single tumor biopsy samples [31]. Circulating tumor DNA (ctDNA) and cell-free circulating DNA (cfDNA) may represent an alternative promising source for accessing the tumor genome, offering the possibility of non-invasive mutational assessment and reducing heterogeneity-related biases compared with single-site

biopsies [32]. It may also enhance the understanding of clonal changes during treatment, and being useful for patient selection and dynamic monitoring of the response to targeted drug therapy over time [33].

Another limitation is the availability, quantity and quality of specimens for sequencing. Indeed, most *NGS* platforms have library preparations optimized for a specific DNA quantity and quality easily obtained from fresh-frozen (FF) samples. However, high-purity FF specimens are often not available. From a research point of view, this limits the size of samples analyzed and thus the statistical power of the studies, and from a clinical point of view the implementation of a sequencing workflow in clinical laboratories is reduced. Many efforts are being made to optimize sequencing protocols on low-quality DNA, derived from formalin-fixed paraffin-embedded (FFEP) specimens, facilitating the widespread application of *NGS* technologies both in research and clinical settings [34, 35].

Finally, there are also ethical issues to be considered and investigated. For example, should patients and family members be informed about incidental findings of novel variants that may be of clinical significance, especially those related to inherited susceptibility to cancer or to other diseases [36, 37]? Indeed, once sequencing data have been mapped, the tumor DNA sequence should be compared with the germ-line DNA sequence from the same patient in order to identify the somatic cancer-specific variants only. During this process, incidental variants in protein-coding genes, including some associated with unrecognized disease, future disease risks, drug response, carrier status, and variants of uncertain significance can be found.

In conclusion, *NGS* technologies have certainly shed light on many dark areas of cancer molecular biology and represent a milestone in recent oncology research. However, there are still many issues to be resolved before the application of this approach in clinical practice can be considered, and to shed light on the many areas that remain in the shadows.

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### Conflicts of Interest

The Authors declare there are no conflicts of interest in relation to this article.

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