Precision Oncology, Signaling Pathways Reprogramming and Targeted Therapy: A Holistic Approach to Molecular Cancer Therapeutics

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Abstract: Cancer is a fatal genetic disease with varying complexities, including immune evasion, treatment resistance and recurrence, and optimized treatment is needed for a proper cure. Molecular studies have revealed that tumors are extremely heterogeneous in nature, leading to the complexity of cancer development, which is ultimately linked to its genetic machinery. Importantly, patients with the same type of cancer respond differently to available cancer treatments, indicating the need for patient-specific treatment options. Thus, in-depth genomic studies of patients' tumors are needed to fully understand the determinants of cancer initiation and progression for effective targeted therapy. Precision oncology has evolved as a form of cancer therapy focused on genetic profiling of tumors to identify molecular alterations involved in cancer manifestation for tailored individualized treatment of the disease. There have been great developments in the formulation and production of anticancer agents in recent years, mainly owing to advances in molecular technologies enabling precise targeting of oncogenic pathways involved in disease progression. This article aims to briefly explain the foundations and frontiers of precision oncology in the context of advancements in the tools and techniques associated with the process to assess its scope and importance in realizing the intended goals.

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GRAPHICAL ABSTRACT

Is it cancer, what is the cancer type?

What is the condition and stage of this cancer?

What is the survival rate for this type of cancer?

What are the factors likely to be involved in the disease progression?

Which driver mutations visibly reprogram the signaling pathways of the tumor cells?

What is the level of tissue heterogeneity and how does it relate to the mutations involved?

What are the likely treatment options? What should clearly work for this cancer?

What can be the appropriate drug combination and dose the patient must receive to recover?

How would the cancer respond to this treatment over time, will it relapse?

Is the patient at higher risk and how well will the precision medication work?

Keywords: Gene Mutation; Cancer Genomics; p53; K-Ras; C-Myc; Bcl-2, Cancer Stem Cells; Targeted Therapy; Immunotherapy, Precision Medicine

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1. Introduction

Cancer is a devastating disease that causes one in six deaths globally and has considerable physical, psychological, and economic impacts on people affected by the disease. It continues to be the second most common cause of hospital death after heart disease, most of which can be prevented by early diagnosis and improved prevention and treatment strategies for the disease. Techniques for the efficient diagnosis of cancer accompanied by the development of efficacious treatment options, and a better understanding of the socioeconomic factors that affect cancer incidence, prevalence, and related deaths across the globe are needed [1,2]. More than 100 cancer types with subtypes have been identified on the basis of location, cell of origin, and genetic variations that influence cancer development and therapeutic response. Most cancers appear in epithelial cells as carcinomas, such as lung, skin, breast, liver, colon, prostate, and pancreas cancer, whereas sarcomas arise from mesenchymal tissues, originating in myocytes, adipocytes, fibroblasts, and osteoblasts. Tumors also develop frequently in hematopoietic tissues, such as leukemia and lymphoma, and in nervous tissues, e.g., gliomas and neuroblastomas. They are among the most common types of cancer, taking a high toll in terms of life and property throughout the world [3,4]. Thus, considering the vast number of cancer cases worldwide, a formal initiative towardds fighting the menace of cancer was needed, which first appeared in the United States as the National Cancer Act of 1971 and was signed by President Richard Nixon to promote cancer research and the application of outcomes for minimizing cancer incidence and mortality rates associated with the disease. The act was euphemistically described as the "War on Cancer", and the National Cancer Program that was borne from this initiative resulted in a concerted effort across the length and breadth of the country to develop the infrastructures required for the treatment, cure, and eradication of cancer [5]. A similar approach was adopted by most other developed and developing nations in the following years to combat the deadly disease, which has succeeded in satisfying the purpose involved to a good extent since then despite the fact, as feared and as evidence suggests, that demographic factors play a role in cancer development [6,7]. Overall morbidity from cancer has decreased, and net survival rates, both short-term and long-term, have increased substantially for all cancers combined in recent decades. The survival rates for cancer types that are responsive to therapy surpass 90% in developed countries, and the prognosis for several other cancer types that were considered the deadliest diseases earlier has improved noticeably in recent years owing to the rapid advances realized in clinical oncology over the years. [8.9]. However, the fight against cancer is far from complete, as an estimation by the WHO in 2018 revealed that the incidence of cancer is expected to double to approximately 37 million new cases by 2040, with no confirmed remedies for most cancer types [10,11]. While researchers continue their endeavors to identify the exact causes of different cancer types and subtypes and develop strategies for prevention, diagnosis, and treatment, cancer remains the leading cause of death worldwide and has a major impact on societies across the globe. Many types of cancer therapies are currently available, such as chemotherapy, immunotherapy, hormonal therapy, targeted drug therapy, radiation therapy, surgery, and stem cell transplantation. One may receive a single type of treatment or a combination of therapies, but regardless of the treatment regimen, a much-needed cure for many cancers remains largely elusive [12]. Therefore, a holistic approach to cancer treatment that effectively addresses the complexities of disease progression, therapeutic resistance and recurrence is the need of the hour. Advances in the fields of cellular and

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molecular biology, genetic engineering, biotechnology and drug development, including recent developments in computational techniques applied to health and disease must address the problem at a fairly convincing level over time.

2. Genetic and Biochemical Basis of Cancer Development

The tumor is an abnormal mass of tissue that appears due to unregulated growth in the division of cells, which successfully prevents senescence. A tumor is benign until it is limited to its original position and becomes malignant or cancerous when it is capable of growing and spreading to other parts of the body. Rigorous research in the past few decades, supported by advances in cell and molecular biology, has led scientists to clearly understand that genetic changes associated with cancer incidence cause the disease to grow and spread to other parts of the body. Cancer is initiated as the result of uncontrolled cell division and proliferation, leading to tumor formation, which culminates in metastasis that involves the dissemination of tumor cells to new sites in the body, resulting in secondary tumors, and is responsible for approximately 90% of cancer-related deaths in reality. Cell proliferation requires a balanced rate of cell growth and division to maintain an increase in cell numbers for growth and development, maintenance of tissue homoeostasis and wound healing. The fundamental abnormality leading to cancer development is unwanted cell proliferation due to an absence of balance between cell division and cell loss through cell death and differentiation. Cell division relies on cell cycle regulation, which generally involves extracellular growth-regulatory signals as well as internal signaling proteins that monitor the genetic integrity of the cell to ascertain that cellular development progresses well in time. It depends on progression through distinct phases of the cell cycle and is regulated by several cyclin-dependent kinases (CDKs) that act in association with their cyclin partners. Alterations in the overall expression pattern of cyclins cause the cellular process to go awry and proliferate rapidly, resulting in tumor formation. Most of the related events accompanying tumor formation and cancer progression, such as cell differentiation, apoptosis, angiogenesis, invasion and metastasis, are guided similarly by alterations in the expression patterns of regulatory portions owing to changes (mutations) in the genes of interest, and the factors that cause these changes often tend to provoke cancer development [13]. Genetic mutations can be inherited or acquired mutations that appear later in life. Acquired mutations are of somatic origin, are much more common and cause most cancers. As the somatic mutation theory (SMT) is evidence-based, and it has become the dominant theory in cancer research.

In fact, cancer is a multistep process involving the initiation and progression of random mutations in certain key genes, such as oncogenes or tumor suppressor genes, which lead to the manifestation of cancer. Every single gene in the body is most likely to have undergone deleterious changes or mutations in its DNA sequence on a number of occasions in the cell's lifetime, while the repair mechanism in place would restrict noticeable changes. In this way, the generation of cancer must be conclusively linked to sustained gene mutations caused by either external agents called mutagens, which often lead to the appearance of different somatic variants, or certain critical changes that might have been inherited in the body. Importantly, a single mutation will not be enough to transform a normal cell into a cancer cell, as it would require a number of changes to accumulate in the cells in due course for cancer development to occur. For example, mutations in the most pronounced cancer-causing genes, such as RAS or MYC, may not lead to unchecked

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proliferation until changes in repressor genes that encode components of protective mechanisms, such as the retinoblastoma gene (RB) or the tumor protein p53 (TP53) gene, have not occurred simultaneously. Thus, multiple genetic changes are typically required for the development of cancer, so it must be seen as an evolutionary process involving both genetic changes and selection [14]. Multiple rate-limiting steps can work against the development of cancer, with persistent changes accelerating the process. Thus, most cancers are thought to be derived from a single abnormal cell or a small group of cells with a few deleterious gene mutations followed by the accumulation of additional changes in some of their descendants, allowing them to outgrow others in number and resulting in tumorous growth in the body. Moreover, cancer can also be driven by epigenetic changes that alter the gene expression pattern of cells without accompanying alterations in the DNA sequence of the cell [15]. Some physical modifications in the chromatin structure that are capable of influencing the pattern of gene expression are often led by DNA methylation, histone modifications, and miRNA-based alterations inside the cell. Epigenetic regulation of DNA and RNA usually controls how genes are turned on or off and thus plays important roles in maintaining normal cell behavior, whose deregulation causes alterations in gene expression patterns to potentially influence tumorigenesis. These changes are frequently accompanied by sustained exposure of the affected cells to several stressful external stimuli presented by certain environmental factors and/or lifestyle-related changes that may involve nutrition, toxicants, alcohol, etc. Although epigenetic changes do not alter the sequence of DNA, the process might cause point mutations and disable DNA repair mechanisms frequently involved in cancer development. Traditionally, epigenetic and genetic changes have been seen as two separate mechanisms that independently participate in carcinogenesis, which may not be the only possible mechanism involved in cancer development. Recent studies from whole-exome sequencing (WES), the technique for sequencing all of the protein-coding regions of genes in a genome, for thousands of human cancers have revealed the presence of many inactivating mutations in genes that can potentially disrupt DNA methylation patterns, histone modifications, and nucleosome positioning and hence control the epigenome to contribute to cancer progression. Thus, both the genome and epigenome can regulate the progression of cancer through associated mutations. Therefore, interference between the two is highly anticipated and can be exploited to provide new possibilities for cancer treatment [16].

Cancer ultimately remains a selective multistep process triggered by mutations leading to the activation of specific oncogenic pathways with the concurrent inactivation of tumor suppressor genes that act as sentinels to control unwanted cell growth and proliferation. Scientists have been trying to analyze the totality of cancer-causing gene mutations, which are regarded as the “mutational landscape” of different types of cancer, and to target them effectively for cancer cure. As a matter of fact, most of these biochemical processes are conserved in model organisms, such as the free-living transparent nematode Caenorhabditis elegans and the fruit fly Drosophila melanogaster, along with other large animal models, and are widely used for ease of genetic manipulation to study the complex biology of cancer. Somatic cell mutations, called somatic structural variants (SVs), have been shown to account for more than half of all cancer-causing mutations. These variants or mutations differ from the hereditary or germline variants that have passed from parents to offspring and become incorporated into the DNA of every cell in the body. These SVs can be observed in transformed cells and in their daughter cells, which may continue to grow because of errors in DNA copying and their repair mechanisms during cell division, thereby altering the

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genomic structure, which becomes more numerous with time. Although somatic SVs play crucial roles in cancer development, relatively little is known about their mode of action in cancer development. Methods to detect and identify the functional effects of these SVs are sure to enable researchers to understand the molecular consequences of individual somatic mutations in cancer. The findings related to mutation-specific molecular alterations could be used to develop therapies that target mutated cells, opening great possibilities in cancer therapy [17].

Furthermore, most of the human genome consists of noncoding regions, and studies on variations in the noncoding regions of cancer cells reveal additional mechanisms underlying cancer progression. For example, changes in noncoding regions such as point mutations and complex genomic rearrangements can disrupt or create transcription factor-binding sites or even affect noncoding RNA loci, leaving options for unwanted changes in the gene expression pattern of the cell. Cancer whole-genome sequencing (WGS) remains the most comprehensive method for identifying variants in noncoding regions, as targeted approaches such as exome sequencing (WES) may miss certain variants residing outside coding regions. Pieces of evidence suggest that oncogenesis typically involves interplay between germline and somatic variants, and different modes of action of noncoding variants could further potentiate these developments. Thus, a systematic approach to unravel the roles of the noncoding genome in cancer progression should help improve cancer diagnosis and therapy [18].

An important aspect of cancer biology is that all cellular behaviors turn out to be a manifestation of underlying cellular physiology and biochemistry that are ultimately guided by the enzymes whose timely availability is controlled by genes. Enzymes catalyze specific reactions within compartments of the cell to maintain a balanced state of being. Cancer-based genomic studies highlight the many ways in which enzyme activities can be altered to contribute to cancer development due to certain genetic changes. Importantly, kinetic parameters associated with enzymatic activities are tangibly altered to influence cancer initiation and progression. Therefore, enzyme-based studies of cancer cells can provide critical insight into the molecular and biochemical mechanisms of cancer progression and help determine the effectiveness of anticancer agents. mechanisms of treatment resistance and disease relapse [19]. Additionally, changes in the tumor microenvironment (TME) can also affect enzyme activity and exaggerate cancer development. Enzymes specifically linked to the regulation of key cellular behaviors such as cell proliferation, death and differentiation may have a direct influence on cancer development, but some enzymes required for many other activities may also be involved in the incidences of cancer due to their crucial role in maintaining tissue homeostasis. For example, monoamine oxidase A (MAOA) is a mitochondrial enzyme found in animal tissues to catalyze the breakdown of biogenic monoamines, and is commonly known for the regulation of neurotransmitters such as dopamine, adrenaline, and serotonin. As cells of the nervous system and immune system have many common surface receptors, secretory molecules, they may share many common cellular pathways crucial to health and disease. Evidence suggests that MAOA is involved in other diseases, including cancer, cardiovascular disease, and diabetes, in addition to its role in neurobiology. MAOA can inhibit the activities of different types of tumor-associated immune cells, such as T cells and macrophages, and has been implicated in the regulation of anti-tumor immune responses. MAOA inhibitors are being studied for their potential in combination therapy to improve the effectiveness of cancer immunotherapy. [20].

Moreover, epidemiological studies have consistently shown that environmental factors

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or lifestyle changes involving mutagenic agents are the primary culprits. Thus, it is necessary not only to associate genetic mutations with different cancers but also to work on the mechanism of action of mutagens by focusing on enzymes that invariably mediate oncogenic transformations. For example, overexpression of the ribonucleotide reductase (RnR) enzyme, which catalyzes the formation of deoxyribonucleotides from ribonucleotides necessary for cell division, is implicated in many forms of cancer, and the genes encoding the components of the enzyme are often mutated, leading to hyperactivity of the enzyme. However, there are instances indicating that cytoplasmic material rather than the karyoplast is mainly responsible for cellular transformation, which might be better explained as a consequence of certain external influences, including epigenetic modulations, than purely genetic changes [21]. RnR active site inhibitors have been developed to biophysically deactivate the enzyme when necessary, with positive outcomes.

3. Cancer Genomics and the Emergence of Precision Oncology

Changes in vulnerable genes involved in cell growth, proliferation, death, or differentiation appear to be essential for all changes in cell behavior and remain the most fundamental feature of all cancers; thus, cancer must be considered a genetic disease to be treated accordingly for better outcomes. Over the years, technological advances in the field of molecular biology have been exploited to unravel genomic changes to fully understand the pathogenesis of human cancer. The range of cancer-causing mutations is known to be very large, and the mutational landscape differs from one another depending on the type of cancer; even people suffering from the same cancer type are found to have considerably different mutation patterns. Moreover, it has long been known that every patient responds differently to particular treatments despite having the same type and stage of cancer. These observations have been compelling and led researchers to adopt a precision medicine approach to cancer therapy, necessitating the study of the genetic features of vulnerable individuals for a patient-specific treatment regimen towardds the most effective treatment of cancer . Since the nineteenth century, biometricians have been interested in decoding the relationship between genetics and diseases and attempting to understand the roles of "constitutional" and "environmental factors" in the distribution of diseases. Werner Kalow's 1962 textbook 'Pharmacogenetics' published on the issue of heredity and the response to drugs, emphasizing the importance of relating the response of therapeutic drugs to their biochemistry and the role of genetics and evolution in shaping individual-level differences,. Advances in genetic engineering and the consequent understanding of clinically relevant genetic variations over the years have revolutionized how a range of diseases can be diagnosed and treated in the clinic, exploiting the genetic peculiarities of individuals, and the idea needs to be adequately applied to cancer research for better outcomes. Accordingly, in recent decades, precision oncology has emerged as a field of cancer research that takes into account the genetic specificities of individuals for efficient cancer treatment. [22]. The term precision oncology has been coined for specific clinical oncology practices that rely upon genomic profiling of individual tumors for complete molecular characterization of transformed cells and tissues to identify and target specific molecular alterations for efficient cancer therapy [23]. Thus, precision oncology aims to achieve perfectly planned cancer therapy by designing a custom-tailored treatment regimen for vulnerable individuals by identifying their unique needs for the best possible results.

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The effectiveness of precision oncology has been tested through progressive clinical trials on different tumor types, and recent precision oncology trials that include the NCI-MATCH (Molecular Analysis for Therapy Choice) or the NCI- MPACT (Molecular Profiling-based Assignment of Cancer Therapy) have helped shift the focus from cancer treatment on type and origin to target cancer-specific genetic mutations for a cure [24]. The discovery of imatinib for the treatment of chronic myeloid leukemia virtually marked the beginning of precision oncology management. The good use of precision oncology in clinics began approximately 25 years ago, but it has significantly improved the effectiveness of cancer treatment and is about to enter mainstream clinical practices. [25]. The emergence of next-generation sequencing (NGS) in 2005 has proven to be massively important in this direction, as this technology is used to determine the order of nucleotides in entire genomes or targeted regions of DNA or RNA and has revolutionized biological research, allowing scientists to study biological systems at a level never tried before. It can provide new insights into the nature of genes and proteins thought to be associated with cancer, and the application of a few such evolving molecular techniques to the study of cancer has also provided biomarkers over the years that have led to new advances in tumor diagnosis, prognosis, and treatment, which have proven to be immensely helpful in advancing precision oncology [26]. There are many potential prognostic, diagnostic and therapeutic markers for cancer, and some are highly effective targets for cancer therapy.

4. The Biology Underlying Tumorigenesis and Cancer Progression

Cancers of different tissues utilize somewhat different patterns to ultimately converge to a common path of cancer development in the form of tumor growth followed by angiogenesis, invasion, and metastasis. All such developments are ultimately guided by genetic and epigenetic changes associated with cancer cells and supported by certain tissue-specific factors that enable the tissue to exploit these changes to meet its specific needs, resulting in reprogramming of the molecular events utilized by different cancer cells, and no gene change is thought to be common to all cancers [27]. Because uncontrolled cell growth and proliferation remain the most evident causes of cancer, certain alterations in the pattern of cell death and differentiation promoting overall cell survival could further aggravate the gradual transformation of tissue from normal to tumorous and from benign to metastatic. Certain disruptions in the physiological balance between cell proliferation and cell death prolong cell survival and proliferation and are thought to be important steps in carcinogenesis. As expected, observations confirm that evasion of cell death by apoptosis and autophagy is the hallmark property of most, if not all, cancers and actively contributes to cell growth and proliferation. Apoptosis, the process of programmed cell death, also known as type 1 cell death, is mediated through caspase degradation activated by mitochondria. It is employed for removing damaged cells and is crucial to the early development and overall maintenance of tissue homeostasis. Loss of apoptotic control enables cancer cells to survive longer, allowing more time for the accumulation of mutations, which can deregulate cell proliferation and differentiation and stimulate angiogenesis and metastasis. Autophagy is the major intracellular degradation system mediated by lysosomes and involves the engulfment of unwanted proteins and damaged organelles in double-membraned vesicles called autophagosomes for destruction and recycling. Autophagy can play a protective role in promoting cell survival, but excessive autophagy plays a suppressive role by inducing

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autophagic cell death, known as type 2 cell death. Autophagy is universally accepted to play a tumor-suppressive role at the early stage, whereas defective autophagy is associated with tumorigenesis. Deregulation of these essential catabolic pathways contributes to the development of a tumor and is often involved in promoting invasion and metastasis. Cancer cells can develop novel mechanisms for evading apoptosis and autophagy, and new discoveries have revealed the possible interaction between these two catabolic pathways. The evidence suggests that the inhibition of apoptosis causes autophagy, whereas autophagy inhibition induces apoptosis. These findings may help the key proteins and intermediates involved in these pathways be exploited successfully in cancer therapeutics. In addition, the ability of cancer cells to maintain constant proliferative capacity may be guided by their transformation into persistent nonsenescent cells. In this context, telomeres are specific repeating DNA structures found at the ends of the chromosome of the cell that protect the genome against unnecessary nucleolytic degradation, recombination, repair, and interchromosomal interactions. Telomeres are maintained by telomerase, which adds nucleotides to telomeres to prevent them from becoming shorter. Germ cells typically express high levels of telomerase to maintain telomere length. In somatic cells, telomere length usually decreases over time, leading cells to undergo senescence with age. Loss of cells in this way generally acts as a barrier to tumor growth, and the transformed cells escape as they maintain their telomeres despite repeated cell divisions because these cells are able to express high levels of active telomerase. Telomerase has become a potential target in cancer therapeutics because it is overexpressed in transformed cancer cells and cancer stem cells in diverse forms of malignancies. Telomere maintenance mechanisms (TMMs) are used by cancer cells through telomerase activation and sometimes by alternate means called alternative lengthening of telomeres (ALTs) to avoid apoptosis. Anti-telomerase therapeutics have been developed to selectively target cancer cells to induce cell death via apoptosis without affecting normal cells [28].

An important feature of cancer is that the population of cells that make up cancer is profoundly heterogeneous at the genetic and epigenetic levels. Tumors usually represent a heterogeneous mass of distinctly differentiated cells that include connective tissue cells, immune cells, cancer stem cells, and vasculature, and these subpopulations of cells can be further distinguished by a variety of features impacting their phenotype that generally involve genetic alterations. Tumors develop this feature mainly because the cancer genome is unstable due to the accumulation of many cancer-causing gene mutations. Genomic instability further promotes genetic diversity by providing the raw material for the generation of tumor heterogeneity [29]. Importantly, there are fragile points in every genome where the DNA is more likely to be mutated when the genome is replicated. These breakage points have frequently been linked to genetic and heritable disorders such as cancer. Moreover, there can be mutations present in certain genes, known as mutator mutations, that further increase the inherent rate of genomic changes, resulting in even greater genetic instability that leads to the accumulation of multiple oncogenic mutations within a cellular lineage. Not all such changes are "malignant", but the rate of such development could translate into cancer manifestation at different stages in a lifetime. Mutator mutations and genetic instability are generalized concepts in cancer genetics, referred to as the mutator hypothesis, which relates to those few mutations that lead to an increased rate of gene mutations leading to chromosomal instability, microsatellite instability, and deregulation of activities related to DNA damage and repair [31].

In addition, there are transposable elements (TEs) present in cells called 'jumping

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genes', which are repetitive sequences of DNA that move from place to place in the genome by different means. and represent almost half of the human genome. They represent a powerful means of genetic modification and have played an important role in the evolution of genomes. TEs are typically regulated from beginning, at the early stage of development and throughout the lifespan mainly by epigenetic mechanisms such as DNA methylation and histone modifications and are crucial for maintaining genomic stability through the regulation of the transcriptomic and proteomic profiles of the cell. Dysregulation of TEs has been implicated in different types of human cancers, with the possibility of chromosomal aberrations, oncogenic activation, transcriptional dysregulation, and noncoding RNA aberrations as potential mechanisms underlying the development of cancer [30]. Moreover, the gradual accumulation of oxidative damage to critical biomolecules such as DNA due to persistent metabolic oxidative stress and inflammation also contributes to genomic instability and related diseases, including cancer, indicating relevant measures for prevention and treatment. This feature of cancer cells has also guided researchers to kill vulnerable cells by inducing lethal genomic instability in the cells through radiation therapy and chemotherapy. It is a rather nonselective means of killing cancer cells with associated side effects, which could be improved by devising methods to selectively target the affected cells inside the body. Researchers have begun examining the genomic data of vulnerable individuals to allow clinicians to embark on personalized radiation therapy.

A crucial component of tissue heterogeneity found in tumors is cancer stem cells (CSCs), which are at the forefront of cancer research owing to their potential to induce cancer development. Recent studies have shown that different subpopulations of CSCs within the tumor mass can be identified on the basis of the expression of cancer stem cell surface markers on normal stem cells with characteristics similar to those of normal stem cells, such as self-renewal and multilineage differentiation capabilities, with a much longer half-life than that of most other cells [32]. The intrinsic properties of self-renewal, multipotency, and longevity render stem cells more susceptible to accumulating gene mutations, leading to neoplastic transformation, as proposed by the cancer stem cell hypothesis [33,34]. They have been found to be the key drivers of tumorigenicity, tumor heterogeneity, recurrence, and drug resistance in many cancer types, and different targeted molecules, including nanoparticle-based drug delivery systems, are being tested for effectively targeting CSC-related pathways for cancer treatment [35,36,37.38]. Moreover, the immune cells in the tumor mass can differ greatly, and an emerging finding of tumor heterogeneity is that tumors from different patients have different degrees of immune cell infiltration and immune cell compositions. The immunologically "hot" tumors present elevated levels of T-cell infiltration, so these tumors are more susceptible to immunotherapy than immunologically "cold" tumors that do not allow similar T-cell infiltration. This immunogenic heterogeneity simply impacts treatment outcomes and may direct treatment planning [39,40].

5. Targeting Genetic Alterations in Medical Oncology

Traditionally, cancer treatments such as chemotherapy and radiation therapy have targeted actively growing cells in the tissue instead of just attacking diseased cells, resulting in a variety of side effects. Therefore, a deeper understanding of the molecular events underlying cancer progression was realized decades ago to develop treatments that selectively target

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affected cells to alleviate the serious side effects of cancer treatment. The functional roles of many critical players involved in tumor growth, tissue invasion, and metastasis have been described precisely in recent decades on the basis of the draft of the human genome and other related developments that took place in the following years [41]. As noted previously, advances in DNA sequencing have revealed that cancer genomes can exhibit thousands of somatic genetic alterations, such as point mutations, DNA copy number variations, differences in RNA transcription and protein expression and epigenetic changes. Furthermore, tumors of similar types and conditions can possess unusually heterogeneous mutation patterns; however, these mutations may actually influence the same characteristic cellular pathways and networks. However, it remains generally unclear which mutational changes could be considered the primary drivers of disease progression or how these changes influence cancer pathophysiology, and extensive genomic data mining and orthogonal modeling are needed to gain insight into the biological mechanisms underlying different cancers. An overview of some of the frequently mutated genes and their protein products in different cancers may be useful for better understanding how certain proteins, with their specific roles in cellular processes, including interactions and networking with many different molecules of the cell upstream or downstream of the chain, may play essential roles in cancer cell reprogramming and disease progression, as well as their importance in cancer treatment.

Retinoblastoma tumor suppressor (RB) and TP53 are central tumor suppressor genes that play crucial roles in cell cycle regulation and genome integrity and are frequently altered in various forms of human cancers. The RB tumor suppressor is a master regulator of the cell cycle that is often mutated or functionally inactivated during cancer development. The Rb protein forms complexes with the E2F family of transcription factors and downregulates several genes that encode key regulators of cell progression through the cell cycle, apoptosis, and DNA repair to preserve genome stability. Their transcriptional repression by the Rb-E2F complex can be relieved through the phosphorylation of Rb, leading to committed cell cycle progression, which can be reversed again at the level of cyclin-dependent kinases. The gene product can also interact with chromatin remodelers and modifiers to repress certain genes crucial for cell cycle progression.

The TP53 gene encodes the p53 protein, a 53 kDa-weighted nuclear protein that functions primarily to ensure genome stability, normal cell growth and proliferation. It is the key player in the tumor suppressive DNA damage response (DDR). ATM (ataxia-telangiectasia mutated), ATR (ATM- and Rad3-related), and other related protein kinases are the initial DDR kinases that help p53 sense damage to DNA and activate other genes to repair damage or suppress cell division to prevent the accumulation of oncogenic mutations that often lead to tumor development. This task is supported by p21, a cyclin-dependent kinase inhibitor (CKI) activated by p53, which serves as a cell cycle inhibitor and anti-proliferative effector of the cell. Stresses such as viral infection or DNA damage, a relatively common oncogenic act, turn on p53 functions, leading to cell cycle arrest for DNA repair, senescence for permanent growth arrest, or apoptosis for programmed cell death. A wide variety of mutations have been identified in the p53 gene, which often occur late during cancer progression. Mutations in the gene not only disable their tumor suppressive function but can also engage in cancer-promoting activities by gaining oncogenic properties or inactivating the remaining suppressive elements in the cell. An estimated 40–50% of human cancers carry deleterious mutations in the regulatory p53 gene [42]. The findings revealed many crucial genes and proteins associated with cancer reprogramming pathways, which could be

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attractive targets for precise cancer treatments. These molecules are thought to participate in crucial cellular events in different ways, eventually leading to uncontrolled cell growth and proliferation, which are responsible for tumor growth. A few common alterations that are frequently implicated in cancer progression with profound effects are detailed below.

MYC genes are a group of related proto-oncogenes that encode Myc proteins, which are commonly involved in the pathophysiology of human cancer. Myc proteins alone may not cause transformative effects, and studies have revealed that changes in tumor suppressor genes such as TP53 and MYC synergistically induce proliferation, survival, and metastasis. It is also a known target of RB repressor protein deregulation, which may result in increased Myc activity. Myc has three family members, C-Myc, N-Myc, and L-Myc, which are essential transcription factors involved in the activation of many protein-coding genes associated with many different biological processes, including cell proliferation and differentiation, cell metabolism, and self-renewal of stem cells. Myc oncoproteins have been shown to mandate tumor cell fate by inducing stemness and blocking differentiation and cellular senescence, and irreversible cell cycle arrest contributes to cancer progression. Additionally, MYC can influence changes in the tumor microenvironment to induce angiogenesis and/or suppress the host immune response. The C-Myc oncoprotein forms a crucial part of a dynamic cellular network whose members interact selectively with one another and with many of the transcriptional coregulators and histone-modifying enzymes that support the maintenance of sustained cell proliferation. C-Myc is constitutively and aberrantly expressed in more than 70% of human cancers, with many of its target genes encoding proteins that initiate and maintain the transformed state [43].

A series of growth factors and their receptors are involved in cancer development and metastasis. Receptor tyrosine kinases (RTKs) are a class of cell surface receptors for many polypeptide growth factors, cytokines, and hormones that can play vital roles in cancer development. RTKs are receptors with specialized structural and biological features capable of dimerizing with other adjacent RTKs, leading to rapid phosphorylation of tyrosine residues on target molecules to initiate several downstream biochemical cascades in affected cells. Upon binding with their specific ligands i.e., growth factors, RTKs, such as fibroblast growth factor receptor (FGFR), epidermal growth factor receptor (EGFR), platelet-derived growth factor receptor (PDGFR), and vascular endothelial growth factor receptor (VEGFR), control vital functions, such as cell growth, proliferation, differentiation, apoptosis, inflammation, and stress responses. These cellular processes can be critical for reciprocal interactions between tumors and stromal cells and play a central role in the control of tumor formation, angiogenesis, and metastasis [44]. The multifaceted role of RTKs makes them suitable candidates for selective targeting in cancer therapy, but their involvement in alternate pathway activation often presents serious challenges to anti-RTK therapy.

Trimeric GTP-binding protein (G protein)-mediated signaling is critical for many cellular processes, and minor defects in related pathways can affect the pathophysiology of a disease. G-protein-linked receptors (GPCRs) are serpentine transmembrane proteins that form the largest group of cell-surface receptors where the G proteins, which remain attached to the cytoplasmic face of the plasma membrane, serve as critical relay centers that couple the receptors to different enzymes or ion channels in the membrane. There are different types of G proteins that specifically associate with a particular set of receptors in the plasma membrane to mediate responses to a variety of signaling molecules, including hormones, neurotransmitters, and local mediators such as cytokines, chemokines, and growth factors. An activated receptor leads to the dissociation of the trimeric G protein, stimulating its

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components in different ways, and the GTP-binding protein subunit serves as a GTPase, which is crucial for GPCR signaling. Studies have revealed that they control many aspects of cancer progression, including tumor growth, cell survival, invasion, migration, and metastasis [45]. All GPCRs have similar structures, and the same mediator can activate many different receptors, making them the most likely targets for drug therapy. Notably, approximately half of all known drugs actively target GPCRs, and genomic studies continue revealing a growing number of new family members, many of which could prove to be potential targets for cancer therapy.

The small GTPase Ras protein belongs to the Ras superfamily of monomeric GTPases, which are highly important targets in cancer therapy. They are the products of the most frequently mutated RAS genes in human cancers. Ras proteins are frequently involved in transporting signals from cell-surface receptors to different intracellular targets inside the cell and serve as transducer and bifurcation signaling proteins capable of changing the properties of the signaling process through multiple downstream pathways, including signaling pathways that reach the nucleus to stimulate gene expression for cell proliferation. It is often required in receptor tyrosine kinase (RTK)-activated signaling pathways involved in stimulating cell growth, proliferation, and differentiation. Mammalian cells express three different yet closely related Ras proteins, K-Ras, H-Ras, and N-Ras, whose mutational activation effectively promotes oncogenesis. The mutation frequency of different Ras isoforms in human cancers varies, and K-Ras is the most frequently mutated isoform leading to tumor formation, invasion, and metastasis in many cancers [46]. The mutation rate for K-Ras is approximately 25% for all tumors but is found to mutate up to 80–90% in pancreatic ductal adenocarcinoma (PDAC). The treatment of PDAC, the most common form of pancreatic cancer and a leading cause of cancer-related death, has thus far been sparsely productive because of the TME, which possesses many stromal cells and a complicated extracellular matrix (ECM). Genomic analysis has recently revealed that PDAC harbors frequently mutated genes, including those encoding KRAS, TP53, CDKN2A, and SMAD4, which can strongly influence cellular processes and change the tumor microenvironment, which in turn affects cancer progression. Drug development to block K-Ras has been partially successful, similar to many other drugs, as affected cells develop resistance to inhibitors, a common problem encountered with drugs designed for cancer therapy [47]. The study of K-Ras resistance mechanisms reveals that researchers may have to explore several different drug combinations to overcome resistance, and few such developments are in the pipeline. Researchers are tirelessly working to target K-Ras and other signaling intermediates associated with cancer to develop novel therapeutic agents for different cancers.

Nuclear factor erythroid 2 (NFE2)-related factor 2 (Nrf2) belongs to the CNC (cap‘n’collar) family of proteins, a group of basic leucine zipper (bZip) transcription factors encoded by basic leucine zipper (bZIP) genes, which serve as master regulators of the cellular antioxidant response. Recent studies have revealed many new roles for Nrf2 in the regulation of essential cellular processes through interactions with other pathways within cells, thus establishing it as a truly pleiotropic transcription factor involved in carcinogenesis. Originally recognized as a target of chemopreventive agents to help prevent cancer, its protective role was altered in 6–7% of cancer cases. A growing body of evidence has revealed that the Nrf2 pathway is involved in the deregulation of the cellular metabolism, apoptosis, and self-renewal capacity of cancer stem cells and is thus an important driver of cancer progression, metastasis, and drug resistance [48].

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The insulin-like growth factor receptor (IGF-1R) is an RTK that binds to IGF1 with high affinity and is an important factor in the growth, differentiation, and context dependent survival of healthy and diseased cells. IGF-1R plays an important role in the anchorage-independent growth of cells, which may enable cancer cells to survive and grow in the absence of anchorage to the ECM and neighboring cells. High gene expression levels of IGF-1 and IGF-1R are associated with the upregulation of pathways supporting cell growth and survival, cell cycle progression, angiogenesis, and metastatic activities during cancer development and are considered essential in many cancer types [49].

The B-cell lymphoma-2 (Bcl-2) oncoprotein is primarily a cell death regulatory protein that controls whether a cell lives or dies via apoptosis. It is a member of a family of regulatory proteins that are actively involved in the regulation of cell death via all major pathways, including apoptosis, autophagy, and necrosis, and serves at the critical junction of multiple pathways with crucial roles in oncogenesis. Aberrant expression of the BCL2 gene may prevent the death of cancer cells and is frequently implicated in prolonged cell survival and therapy resistance in human cancer. The Bcl-2 family of proteins forms subgroups, one of which may inhibit cell death and prolong cell survival by limiting apoptosis, whereas others induce cell death by inducing apoptosis, autophagy, etc. [50]. The gene encoding the Bcl-2 protein is located on chromosome 18 but can be transferred to different chromosomes, as can be observed in many cancer types. Increased expression of prosurvival proteins or an abnormal reduction in death-inducing regulatory proteins, resulting in strong inhibition of apoptosis and other related catabolic activities, is frequently observed in many cancers. Resistance to apoptosis is a key development in several hematological malignancies and is attributed to the upregulation of prosurvival Bcl-2 proteins. The important role of Bcl-2 family proteins in cancer development renders them potential targets for the treatment of different cancers, including solid tumors and hematological disorders. Alterations in Bcl-2 activity with concurrent changes in other important regulators, such as c-Myc or p53, appear to be strongly associated with cancer progression [51]. The recent development of inhibitors of prosurvival Bcl-2 proteins, termed BH3-mimetic drugs wherever applicable, perform as novel agents for cancer treatment.

6. Signaling Pathway Deregulation and Prospective Targets for Cancer Therapeutics

Cancer growth and progression are dependent on complex interactions between tumor cells, surrounding stromal cells and the ECM present in the TME. However, the root cause underlying cancer progression remains genetic and epigenetic alterations linked to the regulation of cell growth and proliferation, cell adhesion, immune suppression, cell death, differentiation, and overall genomic stability of the affected cells, leading them to grow and proliferate uncontrollably beyond barriers [52,53]. It is ultimately driven by dysregulated molecular mechanisms involving tumor suppressor genes, oncogenes, growth factors, cell adhesion molecules, and molecules of the immune system, such as cytokines and chemokines, that may vary among different cancer types and stages. The cell signaling network, as the foremost system of communication between cells and their surroundings that involves a variety of chemical and mechanical signals and networks of intracellular proteins to constitute different molecular signaling pathways, is worth considering here, as all the essentials of cellular behaviors, such as cell growth and proliferation, cell polarity, cell

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metabolism, differentiation, survival, and migration, can be guided by the components of these pathways working in a collaborative manner inside the cell. A signaling pathway, in general, constitutes a cascade or chain of proteins that communicates signals from extracellular signaling molecules or other external stimuli, through the receptor on the cell surface to target genes in the nucleus of the cell and results in the expression of certain proteins that produce some changes in cell behavior, such as cell division and differentiation. Together, different signaling pathways maintain internal circuitry inside cells guided by external stimuli such as growth factors and cytokines, enabling them to sense whether their state of attachment to the ECM and other cells is appropriate, and if different growth factors, hormones, and cytokines guide them to proliferate or differentiate, they can move, stay put for now, or commit to cell death by apoptosis or autophagy [54]. Almost all gene modifications can be related to one or more of these signaling pathways that are deregulated in the affected cells to acquire hallmark properties of cancer. Cancer cell signaling typically involves altered expression of the components of the signaling network, which include many secreted protein receptors, growth factors and cytokines, protein kinases, phosphatases, different cytoplasmic proteins, and transcription factors, leading individual cells to respond to genomic changes with appropriate physiological behaviors. Cell division is regulated mainly by a group of extracellular growth factors that signal that resting cells divide by exploiting their intrinsic regulatory processes. Cytokines signal immune cells to mount coordinated attacks on invading bacteria and viruses and play essential roles in cancer prevention. Thus, signals propagated by growth factors and cytokines can simply tell individual cells to divide or not under particular conditions whose alterations could lead to the pathophysiology of cancer.

The earliest information regarding the relationship between cancer and growth factors came from the observation that normal cells in culture often require serum for proliferation, whereas cancer cells have a much lower requirement for serum. Serum is known for providing growth factors, among other ingredients needed for the overall regulation of the cell cycle. The other indication revealed that gene mutations found in cancer cells cause changes in cell behaviors very similar to those related to the activities of growth factors and their receptors. Oncogenic mutations disrupt the cellular circuits that control cell adhesion and signaling, enabling cells that carry them to overproliferate and invade other tissues in an uncontrolled fashion. Many of these mutations have been directly linked to growth factors and their receptor proteins, which are involved in tumor growth, angiogenesis, invasion, and metastasis [55,56].

Importantly, one type of cell membrane receptor can mediate many different downstream intracellular pathways, and one pathway can also be activated by several upstream surface receptors, revealing common signaling components in multiple signaling pathways. For example, RTKs, such as EGFR, FGFR, IGFR, VEGFR, PDGFR, or GPCR, can activate the MAPK cascade, whereas widely studied RTKs, such as the EGFR/HER family of receptors, can initiate different signaling pathways, including the mitogen-activated protein kinase (MAPK), phosphoinositide-3-kinase (PI3K)/AKT, and mammalian target of rapamycin (mTOR) pathways, which are commonly involved in the regulation of cell growth, proliferation, differentiation, and survival. This feature of the signaling process evidently presents the option for crosstalk between components of different signaling pathways at different stages of the cellular process. A molecule participating in crosstalk can affect the activation of alternate signaling pathways, and receptors can also have an altered ability to bind to ligands, which can swiftly lead to cancer manifestation. As generally observed, most

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cell signaling pathways contribute to the development of cancer, and very few cancer types arise from the deregulation of a single pathway. Breast cancer can arise from elevated expression of the estrogen receptor (ER), EGFR/HER, or IGFR, but in many cases, molecules and intermediates of multiple signaling pathways can be interactively involved in this process. In this way, many signaling molecules affecting cancer cells together could be considered to create elaborate integrated circuits within the cell, derived from the usual signaling circuits that operate in normal cells. The transformed intracellular circuit can be divided into distinct subcircuits specializing in specific cellular activities to promote hallmark features of cancer [57] (Fig. 1)

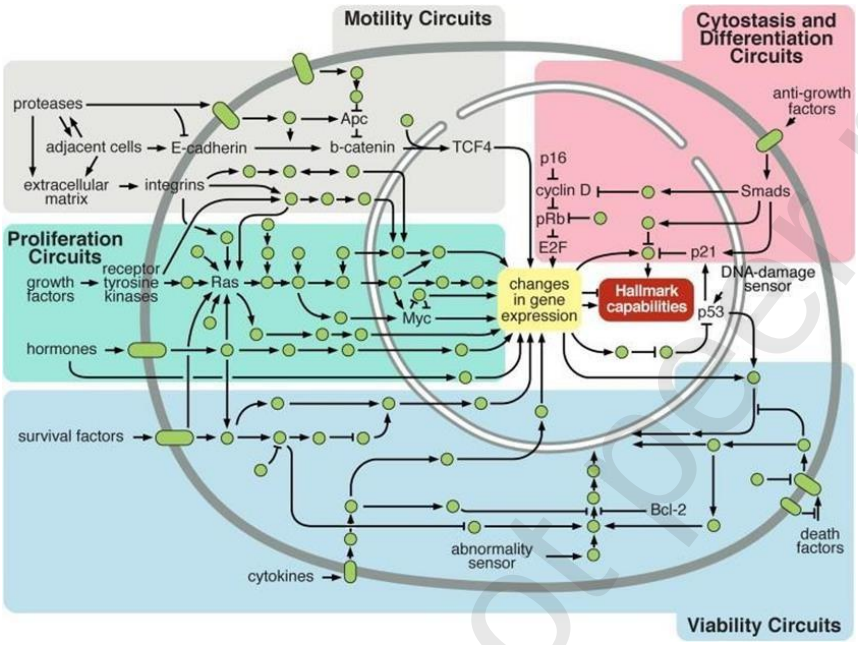

Figure 1. Intracellular Signaling Networks Regulate the Operations of the Cancer Cell. An elaborate integrated circuit operates within normal cells and is reprogrammed to regulate hallmark capabilities within cancer cells. Separate subcircuits, depicted here in differently colored fields, are specialized to orchestrate various capabilities. At one level, this depiction is simplistic, as there is considerable crosstalk between such subcircuits. In addition, because each cancer cell is exposed to a complex mixture of signals from its microenvironment, each of these subcircuits is connected with signals originating from other cells in the tumor microenvironment. (Hanahan and Wienberg [57]. With permission from Elsevier)

Signal transduction pathways that lead to tumor growth, cancer cell migration, metastasis, and drug resistance are often complex processes, as cancer cells typically develop abnormalities in multiple signaling pathways or rely on crosstalk between different pathways and some redundant pathways for the maintenance of growth and survival. As cancer progression involves alterations in signaling pathways due to mutations in relevant genes, it is worth considering that therapeutic intervention that takes into account the biology of the affected cells can pave the way for very effective cancer treatment [58,59]. Importantly, in clinical practice, targeting a single intermediate or pathway results in

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considerable recovery, possibly because it impedes the synergistic signaling process of disease progression. Nevertheless, the constitutive activation of a molecular event that contributes to cancer development can be sustained by different mechanisms, and strategies to inhibit multiple targets or redundant pathways simultaneously with molecular-targeted agents could prove to be an even more effective way to treat cancer and overcome resistance in cancer therapy [60]. This approach has indeed been used with anticipated outcomes in some forms of cancer, indicating the need for more research in that direction. The challenge of identifying the genes and signaling molecules relevant to different cancer types by cutting-edge technologies remains an essential part of cancer research and is most likely to help vulnerable people receive precisely designed treatments for cancer. The representative signaling pathways involved in cancer cell reprogramming and the scope for therapeutic targeting of signaling molecules and intermediates for efficient cancer treatment are briefly discussed here.

Ras/Raf/MAPK signaling pathway: The mitogen-activated protein kinase (MAPK) signaling cascade is the evolutionarily conserved signaling pathway, which is the main route by which extracellular growth factors transmit signals to cells that regulate a wide variety of cellular processes, including cell proliferation, differentiation, apoptosis, and stress response, and abnormalities in this pathway are common in many cancer types [61]. This cascade is rge key downstream effectors of Ras GTPase which involves rapidly accelerated fibrosarcoma (Raf) kinases, MAPK/ERK protein kinases (MEKs), and mitogen-activated protein kinases (MAPKs), also called extracellular signal-regulated kinases (ERKs), The binding of extracellular growth factors such as EGF or FGF to appropriate cell surface receptors stimulates Ras GTPase activities, which in turn activate Raf kinases. The RAF kinase phosphorylates and activates MEKs, resulting in the activation of ERKs. Activated ERK relays signals downstream of transcription factors or other gene regulatory proteins, resulting in the expression of target genes, which has been the subject of intense scrutiny in the treatment of cancer. Importantly, Ras GTPase may act as a molecular switch that controls the activation and regulation of related cellular pathways responsible for different cell behaviors critical to cancer development [62]. Furthermore, the mutational activation of Raf in human cancers supports the important role of this pathway in oncogenesis. Growth factor receptors, such as the TGF-β receptors, EGFR, VEGFR, PDGFR, FGFR, and IGFR, can all activate Ras, ultimately leading to ERK activation. Studies with selected inhibitors against targets in this cascade have shown positive results, such as growth inhibition, antiangiogenic effects, and suppression of metastasis in cancer cell lines and animal models. These results reveal that this strategy is effective at inhibiting cancer cell proliferation and survival, and more clinical trials and validations are ongoing for the efficacious treatment of cancer [63].

PI3K/Akt/mTOR signaling pathway: This pathway can be activated by a variety of factors, such as cytokine receptors, GPCRs, RTKs, and integrins, and regulates several cellular and metabolic activities that lead to cell growth and survival. Phosphatidylinositol (PI) is a unique membrane lipid that is phosphorylated by activated, PI 3-kinase to generate phosphatidylinositol-3,4,5-triphosphate [PI P3], which works as the docking site for intracellular signaling proteins, bringing the proteins together into signaling complexes. The main PI3K effector Akt, also called protein kinase B (PKB), is activated in the process of regulating different downstream targets, including mTOR, to relay signals through the cell.

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The kinase protein mTOR is of particular interest because it works as a master regulator of cellular processes by participating in multiple signaling pathways inside the cell and is actively involved in cell growth, proliferation, autophagy, and apoptosis. The canonical pathway of mTOR activation depends on signaling through PI3K/Akt, although alternative non-Akt-dependent activation through the MAPK pathway is now well recognized. Activated mTOR can assemble into a variety of complexes to catalyze the phosphorylation of multiple targets, including Akt, protein kinase C (PKC), components of insulin-like growth factor receptor (IGF-IR) signaling, and the protein synthesis machinery to influence a variety of cell behaviors. Persistent mutational activation of the PI3K/Akt/mTOR pathway in the absence of different stimuli has been frequently observed in many cancers. Several mTOR inhibitors have also been developed to treat cancer, and some are being evaluated in clinical trials for approval [64,65]. In addition, phosphatase and tensin homologgue (PTEN), a potent tumor suppressor, is a crucial component of this pathway that can work independently as a phosphatase against phospholipids and proteins. Its primary target is PIP3, the direct product of PI3K, which is crucially involved in the signaling process. Mutational deregulation of the PTEN/PI3K network has been associated with many cancer types, including familial cancers. It is a potential means of targeting PI3K-mediated signaling in cancer therapeutics [66]. Adaptive resistance to pathway inhibitors is common, and combination therapy, if well tolerated, may produce favorable anticancer results [67].

JAK/STAT signaling pathway: The Janus kinase (JAK)/signal transducer and activator of transcription (STAT) signaling pathway is actively involved in the regulation of essential cellular activities, such as proliferation, survival, invasion, inflammation, and immune deregulation, which are associated with cancer progression and metastasis. There are seven different signal transducers and activators of transcription (STAT) family proteins in mammals: STAT 1, 2, 3, 4, 5A, 5B, and STAT 6. The Janus kinase (JAK) family comprises four different members: JAK1, 2, 3, and Tyk (tyrosine kinase). This pathway largely involves cytokine signaling, which is closely related to the activities of T and B cells and is often linked to the development of hematological malignancies. When a cell is exposed to cytokines such as interleukin-6 (IL-6) or interferon-gamma (IFN-g), JAK kinases associated with cytokine receptors are activated to phosphorylate and activate STATs. STAT family members, especially STAT3 and STAT5, are involved in cancer progression, whereas STAT1 plays the opposite role by suppressing tumor growth. The target genes of STAT5 may regulate processes such as cell cycle progression, survival, and self-renewal by binding to growth factors and cytokines, and constitutive activation of the pathway leads to high-level expression of genes and proteins, resulting in different forms of cancer [68,69]. It can ultimately be mediated through the suppression of p53 activity, crosstalk with NF-kB signaling, or expression of Runt-related transcription factor (RUNX) family proteins, leading to inflammation and cancer [70]. The activation of the JAK/STAT pathway can be controlled by suppressors of cytokine signaling (SOCS) family proteins, whereas other inhibitory proteins and phosphatases may also contribute to inhibiting the activated state. The upregulation of JAK/STAT proteins, as well as the reduction in different SOCS proteins, are associated with different malignancies, including solid tumors. This signaling pathway has also been associated with the development of tumor tolerance, as hyperactivation of the pathway often leads to an increase in gene expression, resulting in increased activity of regulatory T cells (Tregs), a specialized subpopulation of T cells that work to limit T-cell proliferation and cytokine production, thereby resulting in the suppression of the immune

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response and maintenance of self-tolerance. These specificities of the signaling pathway provide options for effective drug development against pathway intermediates with fewer side effects. Many JAK and STAT inhibitors have been tested for their efficacy in cancer treatment, and a few of these inhibitors have been shown to be clinically relevant. Efficiently targeting the JAK/STAT signaling pathway remains an intriguing strategy in cancer therapy [71,72].

TGF-β/SMAD signaling pathway: Transforming growth factor beta (TGF-β) superfamily proteins serve as multifunctional secreted cytokines whose activities may be deregulated in many diseases, including cancer. TGF-β signaling is known to control many different biological processes, including cell proliferation, differentiation, migration, and apoptosis, and plays context-dependent roles in carcinogenesis. SMAD proteins are the main signal transducers for the canonical pathway of TGF-β signaling. It comprises a family of structurally similar and well-conserved transcription factors that can relay extracellular signals directly to the nucleus and are critically important for regulating cell development and growth. TGF-β initially functions as a tumor suppressor through the SMAD-mediated pathway when TGF-β/SMAD-dependent p15/p21 induction or c-MYC suppression works well to maintain growth arrest, cell differentiation, and apoptosis. However, the situation could be the opposite if SMAD-dependent suppression becomes ineffective under the influence of certain oncogenic mutations or other signaling pathways, and the role of TGF-β could become antiapoptotic, EMT inducers, and carcinogenic. SMAD inactivation under such circumstances convincingly explains the situation-based role of TGF-β in different malignancies. Furthermore, the classical SMAD-independent pathway of TGF-β receptors may engage in crosstalk with other signaling pathways, such as the Wnt/β-catenin, Ras/RAF/MAPK, and PI3K/Akt/mTOR pathways, to play vital roles in carcinogenesis, and a proper understanding of the TGF-β signaling pathway in cancer progression would resolve controversies related to these signaling pathways [73,74]. The wide range of functions associated with TGF-β during cancer progression is now clear, which has led to the development of multiple therapeutic agents targeting different intermediates of the signaling pathway, and a combination of drugs may produce even better results against TGF-β - mediated reoccur rent and metastasizing cancer [75,76].

The Hippo signaling pathway: The Hippo pathway is an evolutionarily conserved major signaling pathway that was originally identified in fruit flies (Drosophila melanogaster) and controls contact inhibition and organ size development. It is a serine/threonine kinase signaling cascade, and its dysregulation has been implicated in many cancer types. Contact inhibition enables normal cells to cease growth and proliferation when in contact with each other, and an absence of this property can lead affected cells to proliferate uncontrollably, resulting in malignant growth. The canonical Hippo pathway comprises a kinase cascade and related regulators that work together as a repressive system involving phosphorylation and inhibition of the two transcription coactivators YAP and TAZ as downstream effectors to execute their role in the regulation of organ size and tissue homeostasis. Phosphatase and protein ubiquitination modulate the activities of the coactivators in the cascade and can also be regulated by the cytoskeleton for their role in the signaling process. When dephosphorylated, YAP/TAZ translocates into the nucleus and interacts with other transcription factors to induce gene expression, leading to cell proliferation and inhibition of apoptosis. The regulation of YAP1/TAZ may be influenced by many other molecular events,

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including crosstalk with Wnt/β-catenin signaling, and is mostly oncogenic. The core activity of this pathway is controlled by cell density, polarity, and energy requirements as well as by ECM stiffness and shear stress, which together can regulate contact inhibition and related development; thus, its activities can be regulated at multiple levels and widely implicated in angiogenesis and chemoresistance [77]. Cell proliferation and stem cell self-renewal can be directly attributed to contact inhibition governed by this signaling pathway.
The noncanonical Hippo pathway operates in tight and adherens junction complexes to control their localization and activity within the cell. Several studies suggest that overexpression of the components of the Hippo pathway contributes to aberrant cell cycle regulation, leading to cancer development. The exact role of the Hippo pathway in cell cycle regulation is not fully understood, but an in-depth exploration of this process could provide effective therapeutic options for cancer treatment. The properties of the extracellular signaling and membrane receptors involved with the pathway remain to be fully known, yet drugs targeting the components of this pathway are under investigation for their efficacy in cancer therapy [78.79].

Wnt/β-catenin Signaling Pathway: This signaling pathway is one of the key signaling cascades involved in the regulation of cell growth and cell polarity during development. It is typically associated with stemness and can be frequently implicated in carcinogenesis. The signaling pathway begins with Wnt ligand–protein binding to the extracellular domain of a Frizzled (Fz) family receptor, a distinct family of GPCRs that generally do not involve the activation of G proteins, to relay signals through the cell via different paths to influence a variety of cellular mechanisms critical to cancer development. The Wnt pathway has been formally divided into the β-catenin-dependent canonical pathway and the β-catenin-independent, noncanonical planar cell polarity (PCP) signaling pathway and the Wnt/calcium pathway. Canonical Wnt signaling is a genetic pathway that promotes normal cell growth and requires meticulous control of a tumor suppressor gene called adenomatous polyposis coli (APC), which functions to limit the activation of β-catenin, preventing excessive cell growth and tumor formation. The APC/β-catenin pathway is a highly regulated process that involves many different proteins. APC itself is a negative regulator and a Wnt antagonist that binds to a variety of proteins, including β-catenin. It is an essential component of the cytoplasmic protein complex that targets β-catenin for proteasomal destruction. Furthermore, MYC and cyclins are important transcriptional targets of this pathway, indicating that they overlap with several tumor-promoting pathways. Mutations that prevent the degradation of β-catenin, including certain mutations in β-catenin or the APC component of the β-catenin destruction complex, distort the regenerative pathway to contribute to cancer progression and metastasis [80]. Deregulation of the signaling pathway results in alterations in cell growth and survival, maintenance of cancer stem cells, metastasis, and immune control, which have been linked to both solid and hematological tumors. The activation of the noncanonical pathway generally involves the recruitment of Rho family small GTPases, which leads to enzymatic rearrangements of the cytoskeleton and/or certain transcriptional activation of effector proteins. Both of these pathways essentially require the binding of Wnt proteins to Frizzled receptors to execute their functions.

Wnt/Ca2+ signaling is followed by G protein-activated phospholipase C activity, leading to intracellular calcium flux and downstream calcium-dependent cytoskeletal rearrangement and/or transcriptional responses. The Wnt signaling pathway is a crucial mediator in maintaining tissue homeostasis, stem cell populations for tissue repair, and wound healing

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and is frequently involved in the manifestation of many cancer types. Mutations in the APC gene are observed in approximately 80% of colon cancers where cancer stem cells (CSCs) are thought to play a critical role in metastasis and relapse, indicating the role of this signaling pathway in maintaining CSCs. The role of Wnt signaling in cancer immune evasion and drug resistance is well recognized, and identifying tumor-specific signaling intermediates as targets for drug action can be crucial for effective cancer therapy. Many different agents effectively targeting molecules of this signaling pathway are being explored for the efficacious treatment of different cancer types [81,82].

Hedgehog (Hh) signaling pathway: Hh pathway is an evolutionarily conserved signaling pathway and one of a few signaling pathways frequently involved in intercellular communication. It is a key regulator of embryonic development that controls cell patterning, proliferation, and differentiation for organ development in mammals as well as in the regeneration and maintenance of tissue homeostasis. This pathway has frequently been associated with birth defects, stem cell renewal, and cancer. Hh signaling depends on three transmembrane receptor proteins. Specifically, Patched, iHog, and Smoothened. Hh proteins are encoded by at least three genes in vertebrates: Sonic, Desert, and Indian hedgehog. Hh functions through a signaling cascade in a context-dependent manner to regulate the balance between activator and repressor forms of glioma-associated oncogene (Gli) transcription factors.
There are three different forms of the transcription factor Gli1. Gli2 and Gli3 are present in vertebrates and may undergo proteasomal processing similar to that of the Wnt pathway to exert their effects in response to appropriate signals. The activated form of Gli moves to the nucleus to bind to its promoter, leading to the transcription of target genes. Mutational changes that lead to excessive activation of the Hh pathway have been implicated in different malignancies. Communication between Hh and major signaling pathways, such as the Wnt, Notch, and TGF-β pathways, plays crucial roles in the pathophysiology of cancer. Several Hh signaling pathway inhibitors have been developed for a range of cancers, and a few agents are thought to be highly effective for patients with recurrent and advanced cancers [83].

The Notch signaling pathway: This pathway is a contact-dependent signaling ne pathway that plays a major role in controlling cell fate decisions and regulating pattern formation during the renewal and development of most tissues and performs major tasks during the embryonic development of animals. Signaling is mediated through the Notch receptor protein, a single-pass transmembrane protein that undergoes successive proteolytic cleavage steps upon activation to perform its action. Notch is activated in a contact-dependent manner by a specific signal protein called Delta, which is present on neighboring cells and leads to the cleavage and release of its cytoplasmic tail, the notch intracellular domain (NCID), which moves to the nucleus, where it regulates the expression of target genes [84]. Notch signaling is associated with the regulation of many cellular processes, such as cell proliferation, survival, differentiation, and apoptosis, through cell-to-cell communication crucial to the development of many tissues. The signaling pathway is a key regulator of self-renewal and differentiation in many cell types and is known to be an important regulator of hematological processes. Notch acts as a context-dependent binary cell fate-determining pathway, and its hyperactivation has been implicated in the oncogenic stimulation of many solid and hematological cancers.

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The Hh and Notch signaling pathways are active regulators of communication between cells and are actively involved in the regulation of EMT, which is critical for organ development, regeneration, stem cell maintenance, and tissue homeostasis. The self-renewal potential of cancer stem cells (CSCs) is attributed to these signaling pathways, which are crucial for maintaining CSCs in the tumor mass and cause disease progression, recurrence, and chemoresistance. Importantly, the Hippo pathway has been found to repress Wnt signaling, which can induce cancer stem cell activities. In addition, alterations in Wnt signaling are known to influence the Hg and Notch pathways alternatively, which can be intrinsically related to the maintenance of CSC properties [85]. Thus, the components of one signaling pathway could influence the performance of the other pathways to synergistically maintain the activities of the CSCs involved in cancer development. This observation presents the option to identify signaling intermediates with confirmed hyperactivities as potential targets in anti-CSC drug discovery for effective cancer treatment. Selective targeting of these pathways, along with other proliferative pathways, such as the PI3K/Akt or RAS/RAF/MAPK pathways, could prove to be an effective strategy for combination therapy of cancer [86, 87].

The NF-κB signaling pathway: This pathway is initiated by the degradation of IκB proteins via IκB kinase (IKK). IkB binds to the NF-κB dimer in the resting state, preventing it from binding DNA, and its degradation leads to the activation of NF-κB and consequent transcriptional activation. This signaling is mediated via both the canonical (NEMO-dependent) pathway and the noncanonical (NEMO-independent) pathway. The canonical pathway is thought to be involved in immune responses and immunosurveillance, whereas the noncanonical pathway is associated with developmental activities. Thus, canonical and noncanonical pathways are generally distinct, but studies have revealed numerous crosstalk mechanisms that connect them, so both pathways may result in a single NF-κB system [88]. Constitutively activated NF-κB signaling may lead to inflammation-related disorders, and its role in pathological inflammation and cancer development is well recognized [89]. Furthermore, NF-κB signaling is associated with epithelial–mesenchymal transition (EMT), which frequently occurs during tumor progression and metastasis. E-cadherin is a well-known tumor suppressor protein; the regulation of the adhesive activity of E-cadherin present at the cell surface is important in cancer, and its repression by NF-κB is attributed to EMT induction. NF-kB has also been implicated in EMT and metastasis through the activation of EMT master-switch transcription factors and is highly invasive [90]. Evidence suggests that the reversal of EMT is triggered by the inhibition of NF-kB signaling, but the activated NF-κB pathway may contribute to antiapoptotic activation, ECM degradation, and E-cadherin-mediated EMT, which results in tumor growth, invasion, and metastasis. NF-κB signaling molecules also communicate with many other signaling pathways, as crosstalk can be mediated by intermediates, such as STAT3 and, GSK3-β, p53, p38, PI3K, or proinflammatory TGF-β proteins, which modulate NF-κB transcriptional activity [91,92]. Thus, targeting the NF-κB signaling pathway represents an attractive approach to anti-inflammatory and anticancer therapies, and inhibitors have been developed to block different steps of NF-κB signaling for cancer treatment [93,94].

The cGAS–STING pathway: The cyclic GMP–AMP synthase (cGAS)-stimulator of interferon genes (STING) signaling pathway represents a key cellular process that controls inflammatory responses in the presence of foreign particles on the basis of dsDNA

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recognition through pattern recognition receptors (PPRs) and thus regulates overall preparedness for the cell to withstand adversity caused by infection or injury. The binding of cGAS to double-stranded DNA (dsDNA) induces the catalytic activity of the synthase and leads to the production of 2′3′ cyclic GMP–AMP (cGAMP), a second messenger molecule that quickly binds to stimulator of interferon genes (STING) dimers localized at the endoplasmic reticulum (ER) membrane, which are then released to undergo further processing, finally resulting in the expression of type I interferons, interferon-stimulated genes (ISGs), and several other inflammatory mediators, proapoptotic genes and chemokines [95,96]. STING also binds and stimulates IKK, triggering the transcriptional activation of NF-κB,, which promotes noncanonical NF-κB responses. This signaling outcome limits type I interferons and the canonical NF-κB pathway as critical, negative regulators of STING effector mechanisms, which can have important biological consequences related to immune evasion and metastasis [95]. cGAS–STING signaling may also induce autophagy and additionally communicate via p53, MAPK p38, and STAT3 signaling in a context-dependent manner [9]. These findings reveal the complex role of this signaling pathway in the regulation of cell behaviors, and mutations associated with this pathway have often been implicated in cancer progression. cGAS-STING is an important pathway in cancer immunotherapy, and inhibitors of these pathways are being used for targeted drug therapy [97].

Rho/ROCK signaling pathway: Components of the Rho/Rho-kinase (ROCK) signaling pathway are potential regulators of the actin cytoskeleton and its dynamics inside the cell. ROCKs (ROCK1 and ROCK2) belong to the AGC (PKA/PKG/PKC) family of serine/threonine-specific protein kinases, which are downstream effectors of the small guanosine triphosphatases (GTPases) RhoA, B, and C and actively participate in a variety of cellular activities controlled by the actin cytoskeleton, including cell polarity, cell contraction, cell cycle progression, proliferation, motility, and invasion. Aberrant Rho/ROCK signaling has been implicated in several cancer types owing to its ability to increase tumor growth, cell migration, metastasis, and extracellular matrix remodeling [98]. Molecular inhibitors with high clinical value for the treatment of advanced solid cancers are being developed to target ROCK1, ROCK2, or both. Moreover, the different activities of ROCK in the immune system make it a potential target in cancer immunotherapy, so ROCK is thought to be of great value in cancer therapeutics. A deeper understanding of this pathway may add new dimensions to future precision cancer therapy [99].

7. Integration of Multiomics and Artificial Intelligence (AI) in Precision Oncology

Multiomics: High-throughput sequencing technologies, also known as next-generation sequencing (NGS), are comprehensive terms used to describe technologies that sequence DNA and RNA rapidly and cost-effectively. It has revolutionized the fields of genetics and molecular biology and aided in the study of biological sciences as never before [100]. Technologies using NGS have been developed that measure some characteristics of a whole family of cellular molecules, such as genes, proteins, or metabolites, and have been named by appending the term "-omics. Multiomics refers to the approach where datasets of different omics groups are combined during sample analysis to allow scientists to read the more complex and transient molecular changes that underpin the course of disease progression and response to treatment and to select the right drug target for the desired

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results [101]. It forms the basis of precision medicine in general and is at the core of the development of precision oncology. The breakthroughs in high-throughput technologies in recent years have led to the rapid accumulation of large-scale omics cancer data and brought an evolving concept of “big data” in cancer analysis, which requires considerable computational resources with the potential to bring new insights into critical problems. The combination of big data, bioinformatics, and artificial intelligence is thought to lead to notable advances in translational research in cancer [102,103].

Artificial intelligence: Artificial intelligence (AI) encompasses multiple technologies with the common aim of computationally simulating human intelligence to solve complex problems. It is based on the principle that human intelligence can be defined in a manner such that a machine can easily mimic and execute tasks from simpler to far more complex ones successfully [104]. Broadly referred to as computer programming, which is enabled to perform specific tasks, the term may be applied to any machine that displays traits associated with human intelligence, such as learning and problem solving. In regular programming, data are processed with well-defined rules to obtain solutions, whereas AI relies on the learning process to devise rules for the efficient processing of data to yield smart results. AI and related technologies have increasingly been prevalent in finance, security, and society and are now being applied to healthcare [105]. It has been widely applied in precision medicine-based healthcare practices and has been found to be highly useful in medical oncology practice. Precision oncology considers the molecular composition of cancer patients for effective targeted therapies, and therefore requires leveraging in-depth knowledge bases on associations of molecular characteristics, cancer types and drugs for therapeutic decisions that can be made by integrating multiple specialized databases via AI techniques. Therefore, many artificial intelligence algorithms have been developed and applied in cancer research in recent years. An exact understanding of the structure of a protein remains the first step toward understanding all of its roles in cancer progression, and therapeutic drugs are also designed using structural information of the target proteins where AI-based techniques can be used for the solutions. Advances in NGS have led multiomics data on cancer to become available to researchers, providing them with opportunities to explore genetic risk and reveal underlying cancer mechanisms to help early diagnosis, the exact prognosis, and the discovery, design, and application of specific targeted drugs against cancer. Thus, integrating multiomics-related studies with artificial intelligence is necessary and is likely to serve the purpose involved adequately over time. With the help of large datasets from multiomics platforms, imaging techniques, and biomarkers found and mined by artificial intelligence algorithms, oncologists can diagnose cancer early at its onset and help direct treatment options for individualized cancer therapy for anticipated results. Thus, advances in AI present an opportunity to perfect methods of diagnosis and prognosis and develop strategies for personalized treatment using large datasets, and future developments in AI technologies are most likely to help many more problems in this direction be resolved swiftly. In this way, AI is thought to be the future of precision oncology for the prevention, detection, risk assessment, and treatment of cancer [106,107].

Machine learning: Machine learning (ML) is a branch of artificial intelligence that aims to develop computational systems with advanced analytical capabilities. It is concerned with the development of domain-specific programming algorithms with the ability to learn from data to solve a class of problems [108]. ML techniques have long been exploited for their

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applications in protein structure analysis. Successful image processing and natural language processing strategies with end–to–end approaches have been very encouraging for their application in healthcare. The most common and purposeful application of traditional ML techniques in healthcare appears to be in the area of precision medicine and is most suited for the data-driven identification of cancer states and the design of treatment options that are crucial to precision oncology-based cancer treatment [109].

Deep Learning: Deep learning (DL) is a subbranch of ML that uses statistics and predictive modeling to extract patterns from large datasets to precisely predict a result. A variety of data, including electronic health records, imaging, multiomics-based reports, and sensor data have appeared in modern biomedical research which are complex, heterogeneous, and poorly defined and need to be mined efficiently to obtain correct results,. To meet this goal, DL uses a machine learning program called artificial neural networks (ANNs) modeled on the human brain that forms a diverse family of computational models consisting of many deep data processing layers for automated feature extraction and pattern recognition in large datasets to address these problems efficiently. The human brain consists of neurons arranged together as a network of nerves processing several pieces of information received from many different sources to translate into a particular reflex action. In DL, the same concept of a network of neurons is imitated on a machine learning platform to emulate human understanding to obtain perfect solutions. The neurons are created artificially in a computer system, and the data processing layers work together to create an artificial neural network where the working of an artificial neuron could be considered similar to that of a neuron present in the brain. Thus, DL is designed to use a complex set of algorithms, enabling it to process unstructured data such as documents, images, and text to find efficient results [110].

The effective development of drugs for the treatment of cancer is a major problem in cancer research, and DL provides immense help to researchers in this regard. Changes in the genetic composition of tumors translate into structural changes in cellular subsystems that need to be integrated into drug design to predict therapeutic response and concurrently learn about the mechanism underlying a particular drug response. A proper understanding of the mechanism of drug action can lead researchers to understand the importance of different signaling pathways, including some new and uncommon pathways associated with tumors, to help develop novel drugs for the therapeutic targeting of diverse forms of cancer. Drug combinations targeting multiple pathways are thought to address the incidence of drug resistance in cancer therapy, and computational models could be used to find solutions. Occupation-oriented pharmacology is the dominant paradigm of drug discovery for the treatment of cancer. It relies on the use of inhibitors that occupy the functional binding site of a protein and can disrupt protein interactions and their functions. New advances in AI have enabled researchers to develop DL-based models to predict the response of tumor cells to synergistic drug combinations to be employed effectively in precision oncology [111]. Researchers continue to discover proteins that may be the key drivers of cancer and need a fuller understanding of the 3D shape, or structure, of these proteins to determine their exact functions in the cell.

A recent development of the DL system is AlphaFold, which has been successfully used to predict the structures of different proteins. It was discovered through critical assessment of structure prediction (CASP), a community-based protein structure modeling initiative to determine the 3D structure of proteins from the amino acid sequence, organized

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by the Protein Structure Prediction Center, which is sponsored by the US National Institute of General Medical Sciences (NIH/NIGMS). CASP is a biannual competition in which a set of proteins whose structures have not yet been revealed are released, and participants attempt to resolve protein structures via experimental methods such as X-ray crystallography, and magnetic resonance nuclear (NMR) and cryo-electron methods. microscopy. Google's DeepMind participated in 2020 with its deep learning-based algorithm AlphaFold and excelled. AlphaFold 2 was introduced in 2021 as a new version of the system with much improved capabilities, which has revolutionized research by simplifying the accurate prediction of 3D structures of proteins. The tool has already determined the structures of approximately 200 million proteins from almost every known organism on the planet [112]. Recently, it has been further upgraded to AlphaFold 3, which can accurately predict protein–molecule complexes containing different subunits and other molecules, such as DNA and RNA. The new version, with enhanced predictive capabilities, is poised to enable researchers to perform advanced molecular modeling and simulation with much broader options for the determination of possible biochemical pathways and effective drug discovery [113]. This revolutionary development in DL will be of great use in understanding the roles of suspected proteins in cancer development and in anticancer drug design.

A newly developed DL system called PocketMiner is an efficient tool for predicting the locations of binding sites on proteins. Proteins exist in a state of dynamic equilibrium with their different conformational structures, including experimentally determined structures that may not have targetable pockets. PocketMiner uses graph neural networks to find hidden areas or pocket formations from a single protein and is thought to be 1,000 times faster than existing methods of finding binding sites on proteins. This technology has led researchers to understand that approximately half of the proteins that were previously considered undruggable might have cryptic pockets that could be targeted successfully by anticancer agents. The AI-based system has multiple uses in cancer management, such as the prediction of treatment response, estimation of survival analysis, risk estimation, and treatment planning, and is becoming the central approach in precision oncology [114].

8. The Cancer Genome Atlas (TCGA) Program is the Landmark in Cancer Genomics Research

The National Institutes of Health (NIH) has taken the lead role in cancer research and is the largest funder of cancer-based initiatives in the world. The National Cancer Institute (NCI), the leading cancer research enterprise, is part of NIH and is committed to exploiting basic cancer research for efficacious cancer therapies. In this context, the Cancer Genome Atlas (TCGA) Program is the landmark cancer genomics program supported by the NIH, which has contributed immensely to realizing the importance of genomics in cancer research and treatment in the last decade and has begun to change the way the disease has been treated in the clinic. It is a joint effort by the NCI and the National Human Genome Research Institute (NHGRI), also a part of the NIH, that began working in 2006 and has brought together researchers from diverse disciplines and multiple institutions to work on the characterization and analysis of cancer at the molecular level for a complete understanding of the genetic basis of human cancer [115,116]. Considering that the genes and pathways affecting different cancer types and individual tumors vary considerably, a complete picture of these alterations is essential for identifying vulnerabilities and discovering precise

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therapeutic solutions. The TCGA research network aims to provide a satisfactory amount of genomic data for analysis to clarify how the disease begins and progresses. Since the start, the TCGA Network has profiled and analyzlysed a vast number of human tumors to discover molecular aberrations at the DNA, RNA, protein, and epigenetic levels and thereby has provided reliable diagnostic and prognostic biomarkers for different cancer types.

As our understanding of biochemical signaling of the cell has increased and the range of possible treatment options has expanded, cancer biomarkers are needed to accurately predict how patients respond to specific treatment regimens, which is vital for precision oncology. Circulating DNA and extracellular vesicles are abundantly released by cancer cells, which can be obtained via liquid biopsy and are excellent sources of a variety of molecular markers. Molecular profiling of these markers can be used to gain crucial information regarding cancer development, including information on tumor heterogeneity. Further, genomic analysis of tumors has certainly become the mainstay in cancer care, and applying it to oncological practice required a clinical support system that could swiftly predict the clinical implications associated with specific mutations. This led to the development of OncoKB, an expert-guided precision oncology knowledge base developed at Memorial Sloan Kettering Cancer Center (MSKCC), in New York, which is among the first to have been recognized as an NCI-designated cancer center as part of the national cancer program of the federal government. OncoKB's curated list of cancer genes with detailed comments is available on its public web resource (https://www.oncokb.org/, https://www.oncokb.org/cancer-genes,), which has been incorporated into the cBioPortal for Cancer Genomics (https://www.cbioportal.org/) to help visualization, analysis, and download of large-scale cancer genomics datasets, allowing researchers to gain a thorough understanding of the genomic alterations involved in cancer. The public cBioPortal site is hosted by the Center for Molecular Oncology at MSKCC and maintained by a multi-institutional team consisting of MSK and others. A vast number of mutations contribute to cancer, and the use of next-generation sequencing-based approaches in clinical diagnostics has led to a tremendous increase in data, with an enormous number of variants of uncertain significance requiring further analysis and validation by means of precise techniques to satisfactorily address the purpose of big data studies [117,118].

Predicting the effects of mutations via in silico tools has become a frequently used approach, but these data cannot be analyzlysed by simply using traditional tools and techniques that have been available to scientists. Therefore, even more advanced computational methods would be needed to gain insights into the molecular and biochemical basis of the origin and evolution of cancer. To meet this goal, a cancer hallmark framework through modeling genome sequencing data has been proposed for the systematic identification of representative driver networks to convincingly predict cancer evolution and associated clinical phenotypes [119,120]. This approach is based on the consideration that possible observable combinations of those mutations must converge to a few hallmark signaling pathways and associated networks responsible for cancer development. In this way, the proposed framework aims to analyze the available data to explain how different gene mutations in different patients have the same downstream effects on protein networks, ultimately leading to a common path of cancer progression and direct treatment planning accordingly. In this context, researchers funded by the NIH have separately completed a detailed genomic analysis of data available through the TCGA program known as the PanCancer Atlas, providing an independent view of the oncogenic processes that contribute to the development of human cancer [121,122]. By analyzlysing over tens of thousands of

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tumors from the most prevalent forms of cancer and focusing on how germline and somatic variants collaborate in cancer progression, the Pan-Cancer Atlas has provided the most comprehensive and in-depth understanding of how and why tumors frequently arise in humans [123,124]. The synchronized view of oncogenic processes based on PanCancer Atlas analyses aims to elucidate the possible consequences of genome alterations on the different signaling pathways involved with human cancers, also reflecting their influence on the tumor microenvironment and immune cell responses, to provide new insights into the development of new forms of targeted drugs and immunotherapies. Furthermore, the stemness features extracted from transcriptomic and epigenetic data from TCGA tumors also present novel biological and clinical insight for cancer stem cell-targeted therapies [125,126]. Thus, the PanCancer Atlas initiative appears to be a natural outcome of the TGCA program dedicated to comprehensive analysis of tumors on the basis of genomic studies to reveal alterations in signaling pathways, patterns of vulnerability and identify prospective targets for the development of precise drug treatments and effective combination therapies.

9, The Cancer Cell Mapping Initiative (CCMI) and Related Programs in Oncogenomics

Nevertheless, because the presence of mutated genes is strongly correlated with cancer incidence and TGCA-based programs provide a large amount of data to analyze to clarify how the disease begins and progresses, very specific causative genes or a small set of genes for most cancers. have not been confirmed after decades of genomic studies. Nobel laureate James D. Watson opined at Cancer World 2013: "We can go ahead and sequence every piece of DNA that has ever existed, but I do not think we will find the Achilles heel of cancer. Still, as a point of reference, the Pan-Cancer Atlas can be taken as a vital resource to explore the influence of mutation on cancer cell signaling for the development of new treatments in the pursuit of precision oncology. Furthering this process, the Cancer Cell Mapping Initiative (CCMI), originally founded in 2015 by researchers from the University of California, San Francisco, and the University of California, San Diego, has been a major development in cancer research dedicated to generating complete maps of major protein-based genetic interactions underlying cancer progression and attempting to develop computational methods using these maps to identify novel drug targets and patient cohorts with common outcomes. It is based on the NeST (Nested Systems in Tumors) map, which relies on an integrated protein network created by combining interaction evidence from major data types, such as protein–protein interactions, mRNA coexpression, protein coexpression, sequence similarity, and genetic codependency. A multiscale molecular community detection method could be applied to the network to detect protein communities at different size resolutions. Smaller communities would overlap with each other and fall naturally within larger communities to produce a hierarchy of molecular systems for affected cells. Finally, a statistical model called HiSig was developed as needed to determine some smaller protein systems as novel protein assemblies on which different mutations would ultimately converge during disease progression. The NeST map thus presented a total of 395 protein systems frequently involved in one or more types of cancer and therefore constitutes a resource on the cancer mechanisms for somatic mutations under consideration. The signaling pathways and associated protein complexes involved, as key steps in disease progression, may be attractive targets for precise cancer therapy. This

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initiative helped successfully determine how hundreds of genetic mutations involved in breast cancer and head and neck cancer affect the activity of certain proteins that ultimately lead to disease progression. Because a vast amount of sequence data from many different cancer types exist, efforts are being made to extract mechanistic insight from the available information via integrated computational and experimental strategies to help place these alterations in the context of the higher-order signaling mechanisms involved in cancer development [127]. Thus, CCMI appears to be a categorical advancement aimed at embarking on a new era of cancer research and treatment on the basis of the complete elucidation of the molecular networks underlying different cancers. This is the defined goal of the CCMI and is likely to create a resource that will be used for interpretation of the cancer genome, enabling the identification of key complexes and pathways to be studied in greater mechanistic detail to properly understand the biology underlying different cancers [128].

Furthermore, the Broad Institute of MIT and Harvard's Cancer Dependency Map (DepMap) initiative, an academic–industrial partnership program formally announced in 2019, is devoted to accelerating precision cancer medicine by creating a comprehensive map of tumor vulnerabilities and identifying key biomarkers of cancer. The DeepMap initiative is focused on screening thousands of cancer cell lines via the use of RNA interference (RNAi) and CRISPR-Cas9 loss-of-function gene-editing strategies to identify genes whose expression may be essential for cancer cell development. CRISPR-Cas9 gene editing is an efficient method for the genome modification of nearly all cell types. CRISPR editing and screening have emerged as powerful tools for investigating almost all aspects of cellular behaviors, which have greatly impacted our understanding of cancer biology and continue to contribute to new discoveries.

A related project called the Cancer Cell Line Encyclopedia (CCLE) project was initiated as a collaboration between the Broad Institute and the Novartis Institutes for Biomedical Research in 2008 and aimed at large-scale genetic characterization of thousands of cancer cell lines to link characteristic genetic alterations with distinct pharmacologic vulnerabilities and to translate cell line integrative genomics into cancer patient stratification. By access to critical genomic data such as gene mutation, copy number variation, gene expression, and methylation profiles from the CCLE, scientists can now predict novel synthetic lethality and identify new molecular markers whose selective targeting can control cells that possess specific genetic mutations. In this way, the initiative has provided a rigorous foundation on which to study genetic variants and candidate targets, design anticancer agents and identify new marker-driven cancer diagnoses and therapies [129]. By all such means, the field of cancer genomics can be seen as constantly evolving to help identify cancer-causing changes to gain a better understanding of the molecular basis of cancer growth, metastasis, and drug resistance and translate cancer research into new cancer therapeutics.

10. Single-cell Technology to Unmask Tumor Heterogeneity

Tumor heterogeneity is a hallmark property of cancer development and broadly refers to the differences between tumors of the same type in different patients, the differences between a primary and a secondary tumor, and the differences in genomic and phenotypic profiles displayed by cells within a single tumor. Heterogeneity within a single tumor, referred to as genetic intratumoral heterogeneity (ITH), has been documented across most

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cancers as an outcome of genome instability and clonal evolution [130,131]. Tumor heterogeneity appears to be a critical phenomenon in the history of individual cancers, as its translational significance may reflect tumor progression, disease recurrence, treatment response, and resistance [132]. Recent investigations on drug resistance and tumor heterogeneity have confirmed the clonal organization of tumors as the underlying basis for drug resistance, thus indicating the need to fully understand the structure and dynamics of ITH to develop advanced treatment strategies for cancer [133,134]. More precisely, the cellular composition of a tumor is known, the underlying mechanism of disease progression is understood, molecules and pathways involved in the process are identified, and far more specific therapeutic strategies could be devised to achieve the desired result. This is the stated goal of precision oncology, and the emergence of single-cell technologies for biological analysis has become crucial in this regard, as they can carry out accurate single-cell measurements to provide a clear picture of tumor heterogeneity and reveal how structural changes in chromosomes can lead to the complex biological processes involved in carcinogenesis [135,136]. Rapid progress in the development of NGS in recent years has provided many valuable insights into cancer genomics, and NGS-based technologies for genomics, transcriptomics, and epigenomics have enabled laboratories to carry out related single-cell measurements efficiently. Single-cell genomics now facilitates the simultaneous measurement of thousands of genes in thousands of 'single' cells from a single sample, allowing researchers to compare the genomes of individual cells to determine the mutational profile of the affected cells to better understand the molecular consequences of different variants present in the tumor. Single-cell template strand sequencing (Strand-seq), a special single-cell sequencing technology, enables independent and efficient analysis of the two parental DNA strands that resolve homologous chromosomes that are similar in shape and structure but not identical within single cells, which is crucial for identifying somatic SVs, understanding genomic rearrangements and unmasking tissue heterogeneity. Moreover, single-cell sequencing can also be combined with CRISPR knockout screening, which exploits the efficiency and flexibility of CRISPR–Cas9 genome editing to enable large-scale studies regarding how genetic modifications can affect cell behavior or gain insights into the specific physiological conditions required to fully understand the underlying cellular events [137]. Combining the CRISPR–-Cas system with single-cell techniques for studying gene functions with the concurrent use of single-cell resolution techniques, such as flow cytometry, microfluidics, manual cell picking, or micromanipulation, can be exploited in cancer research in many ways, including identifying novel drug targets, studying unknown mechanisms of action of drugs and designing treatment regimens [138].

The importance of epigenetic reprogramming in cancer is well understood, as evidenced by the fact that chromatin regulators are often mutated in affected cells, and widespread epigenetic changes throughout cancer genomes can be identified and linked to the activities of different known oncogenes and tumor suppressor genes. Abnormal epigenetic changes are usually influenced by aging, viruses, and dietary and environmental factors that frequently contribute to cancer development. The interrelationship between genetic and epigenetic changes needs to be further examined for the discovery of screening markers to optimize pathways of diagnosis and prognosis and to develop strategies for individualized cancer treatment [139]. For example, DNA methylation is known to be associated with cell differentiation, aging, and diseases, including cancer. A considerable amount of understanding exists regarding tissue-specific DNA methylation patterns, but much less information about person-specific DNA methylation causing cancer is available.

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Thus, the premise of single-cell epigenome profiling holds great possibilities for deciphering the cellular state and characterizing tumor heterogeneity, with an option for therapeutic interventions to pin specific mutations that have profound effects on epigenetic pathways. The inclusion of epigenetics in clinical practice would require identifying epigenetic signatures that mediate distinct phenotypical changes of clinical relevance, such as epithelial mesenchymal transition, dormancy, and quiescence or therapy resistance.

Single-cell sequencing technologies have largely been successful in helping scientists understand the cell types and features associated with tumors; however, the spatial context of this development is essential to better understand how cells organize and communicate across tissues to fully unlock the repertoire of tumor heterogeneity. Therefore, a clear understanding of which cells are present, where they are situated in tissue, their biomarker expression patterns, and how they organize and interact to influence the tissue microenvironment is needed. This is an essential part of spatial biology and adds another dimension to single-cell analysis to unmask tumor heterogeneity [140,141]. Spatial biology simply combines whole-slide imaging (WSI), commonly referred to as 'virtual microscopy', at single-cell resolution to visualize and quantify biomarker expression and reveal how cells interact and organize across the entire tissue landscape. This technique can support research for early biomarker discovery to late-stage translational research and therapy development. The latest development in this area is spatial transcriptomics, which has enabled researchers to visualize and quantify RNA down to the subcellular level and simultaneously compare gene expression in situ. It is a groundbreaking molecular profiling method that exploits multiomics technologies, allowing researchers to measure all the gene activity in a tissue sample and assay the genetic information of single cells within their native tissue environment [142,143]. The growing ability to demonstrate the role and function of distinct cell types present in the tissue has paved the way for a new understanding of the tissue-specific cellular pathways and interactions that lead to cancer manifestation. Thus, molecular analysis of cancer cells on the basis of single-cell technologies aims to present an accurate picture of the most recent developments regarding changes in genes and proteins responsible for alterations in cellular processes, enabling a better understanding of the prognosis and pathways involved in the development of cancer. New advances in multiomics techniques powered by AI have enabled researchers to integrate genomic, transcriptomic, epigenomic, and other related data to gain the most accurate information on the activity state of individual genes and proteins to reveal novel cancer drivers and genetic vulnerabilities for prevention and cure [144,145]. The emerging field of single-cell technology thus provides unprecedented insight into the complex genetic and epigenetic heterogeneity within individual tumors for advanced precision oncology-based treatment and is likely to streamline future research directions.

11. Precision Oncology and Targeted Drug Therapy for Cancer

Targeted cancer therapy is a form of cancer therapeutic that targets specific genes and proteins involved in cancer cell reprogramming, signaling molecules, and other molecules in the tumor microenvironment that contribute to cancer development. This contrasts with the single-target approach employed in chemotherapy to primarily target and kill actively dividing cancer cells with serious side effects; thus, the emergence of targeted drug therapy can be seen as a natural outcome of decades of studies on the molecular reprogramming of

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affected cells in different cancers. Some notable breakthroughs have been made in certain cancers, as a renewed understanding of the signaling pathways underlying cancer development has led to the development of specific targeted drugs that have revolutionized the treatment of cancer. This form of cancer therapy can be thoroughly optimized by means of precision oncology, which enables the use of genomic profiling of patient samples for insights into the mutational changes underlying pathway alterations responsible for cancer initiation and progression [146]. Precision oncology-based treatment strategies pledge the diagnosis and prognosis of this disease via the use of specific molecular-level information about a patient's tumor to treat the illness with desired results. In this way, this method is a perfect theranostic approach for cancer treatment. The term ‘theranostic’ literally means a combination of diagnosis and therapeutics and refers to the pairing of diagnostic methods such as the proteogenomic approach to biomarker discovery, with appropriate therapeutic interventions for effective management of the disease. Theranostics focuses on patient-centered care and thus provides a transition from conventional to personalized medicine for targeted, efficient and safe pharmacotherapy relevantly applicable in precision oncology [147,148].

The anticancer drugs employed in targeted therapy are designed mainly to target selected molecules directly involved in cancer cell signaling or those in the tumor microenvironment essentially required for tumor growth and cancer manifestation [149]. They are broadly classified as monoclonal antibodies (mAbs) or small-molecule drugs. Small-molecule drugs are designed to directly approach the cell membrane and interact with targets inside the cell and usually inhibit the enzymatic activity of target proteins such as the proteasome complex, cyclin-dependent kinases and a variety of signaling proteins. Kinase family proteins, such as tyrosine kinases, Rho kinases, Bruton tyrosine kinases, ABL kinases, and NAK kinases, play essential roles in modulating signaling pathways associated with cancer progression and therefore constitute valuable sources of biological targets against cancers (Table 1). A type of targeted therapy, called tumor-agnostic therapy, uses drugs and other substances to target cancer-specific genetic changes or markers to treat the problem without requiring a focus on the cancer type or where the disease may have started in the body.

Therapeutic targeting of DNA damage response (DDR) signaling is another emerging field of targeted cancer therapy that exploits the options of targeting cancer cells with excessive deficiencies in homologous recombination (HR) signaling, which includes BRCA-mutated cancers. Poly(ADP–ribose) polymerase (PARP) and inhibitors of poly(ADP–ribose) glycohydrolase (PARG) are the most important DNA repair enzymes that work synergistically in many different DDR pathways, including base excision repair, nonhomologous end joining, nucleotide excision repair, homologous recombination (HR), maintenance of replication fork stability and nucleosome remodeling. These enzymes are essentially involved in the process of single-strand break (SSB) repair, whose failure leads to the conversion of SSB into double-strand breaks (DSBs), which require repair by HR to prevent cell death. Such lethal genetic interactions, known as synthetic lethality, can be exploited to develop anticancer therapeutics, and the enzymes involved in DDR signalingsignalling fit the needs well. The overexpression of these proteins has been observed in different cancer types, such as pancreatic, prostate, breast, ovarian, and oral cancers, suggesting that inhibiting PARP activity can be an effective therapeutic strategy. PARP and PARG inhibitors have shown improved results in different forms of tumors and are under investigation for safe use in combination therapy. [150,151].

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Table 1. List of Protein Kinase Inhibitors approved by FDA.
(NRY, nonreceptor protein-tyrosine kinase; RTK, receptor protein-tyrosine kinase;S/T, protein-serine/threonine kinase; T/Y, dual-specificity protein kinase)

Protein kinase inhibitor	Approval year	Primary targets	Target kinase family	Indications
Abemaciclib	2017	CDK4/6	S/T	Breast cancer
Acalabrutinib	2017	BTK	NRY	Lymphoma
Afatinib	2013	ErbB1/2/4	RTK	Lung cancer
Alectinib	2015	ALK, RET	RTK	Lung cancer
Avapritinib	2020	PDGFR	RTK	Gastrointestinal Cancer
Axitinib	2012	VEGFR1/2/3	RTK	Kidney cancer
Binimetinib	2018	MEK1/2	T/Y	Melanoma
Bosutinib	2012	BCR-Abl	NRY	Leukemia
Brigatinib	2017	ALK	RTK	Lung cancer
Cabozantinib	2012	RET, VEGFR2	RTK	Thyroid. kidney, hepatocellular cancer
Capmatinib hydrochloride	2020	c-MET	RTK	Lung cancer
Ceritinib	2014	ALK	RTK	Lung cancer
Cobimetinib	2015	MEK1/2	T/Y	Melanoma
Crizotinib	2011	ALK, ROS1	RTK	Lung cancer
Dabrafenib	2013	B-Raf	S/T	Melanoma; lung, thyroid Cancer
Dacomitinib	2018	EGFR	RTK	Lung cancer
Dasatinib	2006	BCR-Abl	NRY	Leukemia
Encorafenib	2018	B-Raf	S/T	Melanoma, colorectal cancer
Entrectinib	2019	TRKA/B/C, ROS1	RTK	Lung cancer; solidTumors
Erdafitinib	2019	FGFR1/2/3/4	RTK	Urothelial carcinoma

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Erlotinib hydrochloride	2004	EGFR	RTK	Lung, Pancreatic cancer
Everolimus	2009	FKBP12/mTOR	S/T	Breast, kidney cancer, Neuroendocrine tumors
Fedratinib	2019	JAK2	NRY	Myelofibrosis
Futibatinib	2022	FGFR2	RTK	Cholangiocarcinomas
Gefitinib	2003	EGFR	RTK	Lung cancer
Gilteritinib	2018	Flt3	RTK	Leukemia
Ibrutinib	2013	BTK	NRY	Lymphoma
Imatinib mesylate	2001	BCR-Abl	NRY	Leukemia; Gastrointestinal
Infigratinib	2021	FGFRs	RTK	Cholangiocarcinoma
Lapatinib ditosylate	2007	ErbB1/2/HER2	RTK	Breast cancer
Larotrectinib	2018	TRKA/B/C	RTK	Solid tumors
Lenvatinib	2015	VEGFR, RET	RTK	Hepatocellular, endometrial, Thyroid, Kidney cancer
Lorlatinib	2018	ALK	RTK	Lung cancer
Midostaurin	2017	Flt3	RTK	Leukemia
Mobocertinib	2021	EGFR with exon 20 insertions	RTK	Lung cancer
Neratinib	2017	ErbB2/HER2	RTK	Breast cancer
Nilotinib	2007	BCR-Abl	NRY	Leukemia
Osimertinib	2015	EGFR T790M	RTK	Lung cancer
Pacritinib	2022	JAK2	RTK	Myelofibrosis
Palbociclib	2015	CDK4/6	S/T	Breast cancer
Pazopanib hydrochloride	2009	VEGFR1/2/3	RTK	Kidney cancer; soft tissue sarcoma
Pemigatinib	2020	FGFR2	RTK	Cholangiocarcinoma

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Pexidartinib	2019	CSF1R	RTK	Tenosynovial giant cell tumor
Pirtobrutinib	2023	BTK	NRY	Lymphoma
Ponatinib hydrochloride	2012	BCR-Abl	NRY	Leukemia
Pralsetinib	2020	RET	RTK	Lung cancer
Quizartinib	2023	FLT3/STK1	RTK	Leukemia
Regorafenib	2012	VEGFR1/2/3	RTK	Gastrointestinal, Colorectal, Hepatocellular cancer
Ribociclib	2017	CDK4/6	S/T	Breast cancer
Ripretinib	2020	KIT/PDGFR	RTK	Gastrointestinal cancer
Ruxolitinib phosphate	2011	JAK1/2/3, Tyk	NRY	Myelofibrosis
Selpercatinib	2020	RET	RTK	Lung, thyroid cancer
Selumetinib	2020	MEK1/2	T/Y	Neurofibroma
Sorafenib tosylate	2005	VEGFR1/2/3	RTK	Thyroid, Kidney, Hepatocellular cancer
Sunitinib malate	2006	VEGFR2	RTK	Gastrointestinal, kidney, pancreatic cancer
Temsirolimus	2007	FKBP12/mTOR	S/T	kidney cancer
Tepotinib	2021	Met	RTK	Lung cancer
Tivozanib	2021	VEGFR2	RTK	kidney cancer
Trametinib	2013	MEK1/2	T/Y	Melanoma
Trilaciclib	2021	CDK4/6	S/T	Lung cancer
Tucatinib	2020	ErbB2/HER2	RTK	Breast cancer
Vandetanib	2011	VEGFR2	RTK	Thyroid cancer
Vemurafenib	2011	B-Raf	S/T	Melanoma; histiocytic sarcoma
Zanubrutinib	2019	BTK	NRY	Lymphoma

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Therapeutic mAbs are modified monoclonal antibodies that target antigens found on cancer cells or cytotoxic T lymphocytes in targeted cancer therapy. mAbs are important in cancer treatment because they may be exploited for potentiating the natural immune system by successfully mutualizing changes in the immunogenicity of affected cells during oncogenesis. mAbs may be designed to coat cancer cells to be opsonized and destroyed by immune cells, block the activity of different cancer-specific antigens called neoantigens generated by cancer cells, or inhibit the activities of immune checkpoint proteins that promote immune evasion during cancer development [152,153]. Several immune checkpoint proteins are expressed by immune cells, such as T cells and cancer cells, which are capable of binding with other partner proteins to help cancer cells escape immune responses. Their activation limits vital immune cell activities such as T-cell infiltration and other effector cell functions, resulting in tumor formation. CTLA-4 is a checkpoint protein present on the T-cell surface that binds to another protein called B7, preventing T cells from killing other target cells, including cancer cells. Certain mAbs, also called anti-CTLA4 monoclonal antibodies, are used to block CTLA-4 and are widely used as immune checkpoint inhibitors in a variety of human cancers (Fig. 2). Different forms of monoclonal antibody-based therapy have proven to be efficacious in cancer treatment and are becoming increasingly important tools in targeted cancer therapy [154,155]. Importantly, cancer cells express a number of protein antigens that can be recognized by cytotoxic T lymphocyte (CTL) T cells, thus providing a means for CTL-mediated cancer therapy. The targeting of transformed cells by CTLs may be crucial for the prevention of both hematological and solid tumors, and the roles of these cells are being explored in cancer immunotherapy. T-cell transfer therapy, also called adaptive immunotherapy or immune cell therapy, is a new form of cancer treatment designed to exploit the enhanced antitumour immune response of tumor antigen-specific CTLs found in tumors and has been used effectively against neoantigen-possessing cells in recent years. Two types of T-cell transfer therapy, tumor-infiltrating lymphocyte or TIL therapy and CAR-T-cell therapy, have been used, and both involve harvesting autologous T cells infiltrated into the tumor, growing large number of these cells in vitro, and administering them to the patient for the desired results. CAR-T-cell therapy is similar to TIL therapy except that T cells are designed to express a type of protein known as CAR (CAR for chimeric antigen receptor) to target specific antigens expressed in cancer cells in the body. Although CAR-T cells have significantly improved the landscape of hematological malignancies, they have shown limited results in solid tumors, as solid tumors present certain obvious barriers to adoptive T-cell transfer and localization, but a variety of approaches are being developed to overcome these barriers to increase their specificity, efficacy, and safety in the treatment of different malignancies. The development of CAR-T-cell therapy for solid tumors has also been impaired because most target antigens are similar to those of normal cells. Research is being directed to develop a toolbox of novel chimeric antigen receptors (CARs) that could be programmed to use logic to discriminate between normal and cancerous cells to prevent toxicity. This development could help overcome some of the barriers to the application of CAR-T cells against solid tumors.

Furthermore, therapeutic cancer vaccines, such as dendritic cell (DC) vaccines, peptide vaccines, and RNA-based neoantigen vaccines, have been developed to induce CTLs against antigens in cancer patients and have shown encouraging results. These vaccines can be designed to induce the production of biomolecules capable of targeting the shared antigens expressed by cancer cells through appropriate immune responses and are being investigated for their efficacy as neoantigen-targeted individualized cancer vaccines. Dendritic cells (DCs) are specialized antigen-presenting cells (APCs) known for their ability to present antigens to T cells, and this property of DCs has been exploited for their application in therapeutic cancer vaccines, which have been shown to induce protective antitumor activities. [156,157].

In addition, the transposable elements (TEs) usually present in the TME are potentially useful for

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creating a pancancer vaccine that can aid in the prevention of a range of cancers. An enumerable number of regions with TEs are involved in the expression of proteins in cancer cells. Many of these are shared across tumors of the same type and could provide means for destruction by the immune system. The goal of immunotherapy is to activate an individual's own immune system against evolving tumors to successfully target transformed cells with high selectivity, low toxicity, and appropriate results. Thus, immunotherapy remains the frontline area of cancer research, and precision oncology will be focused on immunotherapy accordingly.

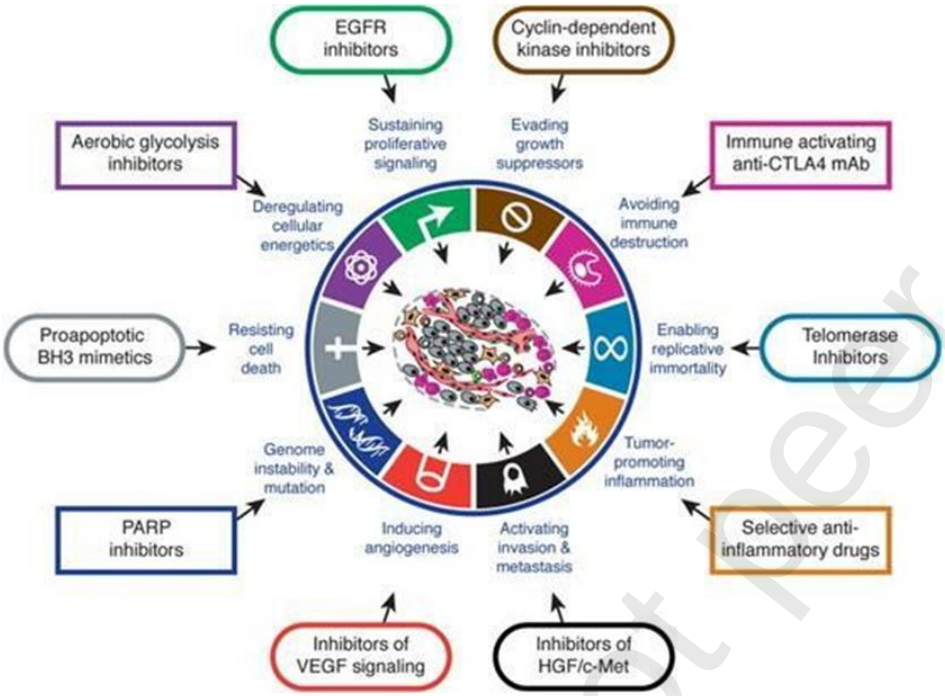

Figure 2. Therapeutic Targeting of the Hallmarks of Cancer
Therapeutic agents that can mitigate the acquired capabilities necessary for tumor growth and cancer progression are being developed for clinical use in treating different cancer types. These drugs are being developed in clinical trials to target each of the emerging neoplastic characteristics and the enabling hallmark capabilities for effective cancer therapy. The listed drugs are illustrative examples; there is a deep pipeline of investigational drugs in development to target different signaling molecules that lead to hallmark capabilities. (Hanahan and Wienberg [57]. With permission from Elsevier)

As discussed earlier, a major concern in cancer therapeutics is proper drug delivery to the affected cells and tissue for the desired outcomes. Conventional chemotherapeutics may have several serious side effects due to nonspecific targeting or inability to enter the core of the tumor, resulting in impaired treatment and a low survival rate. Researchers have been trying to address this issue with more specific methods of drug delivery, including the use of nanoparticles (NPs) in cancer therapeutics. NP-based systems can be programmed to recognize cancerous cells for selective and accurate drug delivery with increased drug localization, cellular uptake, and bioavailability, avoiding encounters with healthy cells. Newly developed quantum dots (QDs) are a class of heterogeneous fluorescent nanoparticles, the nanoscale materials with sizes ranging from 1 to 10 nm, unique optical properties and optimal surface chemical properties to link with targets such as antibodies, peptides, and other

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small-molecule drugs. As photoluminescent nanostructures possess fully quantized energy states with superior fluorescence characteristics, they are thought to be more specific and effective methods with wide applications in the diagnosis and molecular targeting of transformed cells. NP-based drug delivery systems, in general, display better pharmacokinetic and pharmacodynamic profiles, including efficient targeting of cancer cells and a reduction in side effects, and are sure to serve the needs of precision oncology-based therapy satisfactorily [158,159]. Furthermore, the use of antibody–drug conjugates (ADCs) is a fast-expanding therapeutic strategy designed to selectively deliver drugs to cancer cells. ADCs are monoclonal antibodies linked with small-molecule cytotoxic drugs through a chemical linker capable of approaching cancer cells and attaching to specific tumor antigens on the cell surface for direct drug delivery, sparing healthy cells in the surroundings. They are designed to exploit the features of antigen–antibody specificity for efficient drug delivery and are considered to be magic bullets in targeted cancer therapy [160, 161]. In this way, precision oncology seems to be the best fit for strategizing effective means of targeted drug therapy by exploiting the genomic peculiarities of individuals or a cohort of patients for effective personalized cancer treatment. Rigorous research on the genetic profile of cancer cells will continue to gain a thorough understanding of alterations in key signaling pathways and related molecular events during cancer progression, therapy resistance, and recurrence to help improve targeted cancer therapy (Suppl. 1-4).

Recent advances in cancer genomics and single-cell technologies have made targeted therapy the accepted form of cancer treatment; however, a large amount of investment will be needed for future research, drug discovery, and diagnostics to fully unlock its potential and for its application in the management of cancer. The socioeconomic burden of cancer remains high, as the treatment options for most common cancers have been limited thus far, which is an indication for a renewed approach to expedite drug development to bring effective anticancer agents from the bench to the bedside in a cost-effective manner. The lack of understanding of the genetic heterogeneity of individual cancers has traditionally limited the search for efficacious agents for cancer treatment, and a wide range of possibly suitable agents from other disease areas has been missed. The use of molecular characterization of different cancer types through cancer genomics can help resolve drug-related issues to a reasonable extent by repurposing certain existing drugs as anticancer agents for a wide range of applications, and it will remain at the forefront of precision oncology [162,163]. Furthermore, the move from tissue-based cancer-specific treatments to genome-based targeted treatments entails the reuse of anticancer drugs prescribed for one type of cancer to treat other cancer types as well. With the increasing understanding of cell signaling mechanisms and genetic alterations in carcinogenesis, considerable progress in cancer treatment may be realized in the near future. Considering that academia, industries, and civil society will work in tandem to cater to the contemporary needs of the system, it is hoped that a wide range of people with cancer will benefit from this new development in cancer research in the future to benefit the system as a whole [164,165].

12. Conclusion

Precision oncology-based cancer therapeutics propose the development of treatments that target the specific molecular characteristics of an individual's tumor instead of targeting the common features of certain cancers for a cure. Considering that a thorough understanding of the genetic composition and heterogeneity of an individual's tumor is now becoming possible through single-cell technologies, it is poised to help individuals obtain the right treatment at the right time rather successfully without requiring more generalized treatment that would ultimately prove ineffective. Furthermore, cancer research has traditionally focused on common cancers for obvious reasons, leaving therapeutic options

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for less frequent tumor types largely limited, and such anomalies are likely to be successfully addressed with new developments. In addition, precision medicine approaches to treat inherited diseases have been used for directly targeting associated pathways and proteins, and such methods can also be employed in the treatment of inherited cancers. Importantly, drug resistance has traditionally been a serious problem in cancer treatment, but the emergence of targeted drug therapy based on precision oncology can greatly improve outcomes. The evolution of gene detection methods, liquid biopsy, and single-cell sequencing technology could facilitate deciphering the molecular mechanism of tumor drug resistance to help develop updated and effective anticancer agents in response to drug resistance. Thus, precision oncology, which relies on the genomic specificity of individuals for successful targeting of the most specific pathways involved in disease progression, is best suited to ensure precise treatment of the disease. This is, in fact, a natural outcome of cancer genome research; the level of support from multiomics platforms is most encouraging, and it is poised to satisfactorily achieve the intended goal of cancer initiatives. The growing success of this form of treatment is sure to further strengthen our belief in the possibility of an effective treatment for cancer, and it must be made available to an increasing number of people with cancer to achieve the goals over time.

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