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**Applications of artificial intelligence in, early detection of cancer, clinical diagnosis and personalized medicine**

Ullah M *et al*. AI in cancer

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**Abstract**

Artificial intelligence (AI) refers to the simulation of human intelligence in machines programmed to convert raw input data into decision-making actions, like humans. AI programs are designed to make decisions, often using deep learning and computer-guided programs that analyze and process raw data into clinical decision making for effective treatment. New techniques for predicting cancer at an early stage are needed as conventional methods have poor accuracy and are not applicable to personalized medicine. AI has the potential to use smart, intelligent computer systems for image interpretation and early diagnosis of cancer. AI has been changing almost all the areas of the medical field by integrating with new emerging technologies. AI has revolutionized the entire health care system through innovative digital diagnostics with greater precision and accuracy. AI is capable of detecting cancer at an early stage with accurate diagnosis and improved survival outcomes. AI is an innovative technology of the future that can be used for early prediction, diagnosis and treatment of cancer.

**Key words:** Artificial intelligence; Cancer; Clinical tumor prediction; Early detection of cancer; Clinical diagnosis; Personalized medicine

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**Core tip:** Early detection of cancer potentially enhances the chances for successful treatment and patient survival outcome. Artificial intelligence (AI), a field of computer science, aims to develop algorithms or computer programs with advanced analytical or predictive capabilities. The development of highly accurate AI algorithms for the early recognition of the disease is crucial not only for the rapid identification and diagnosis of cancer patients, but also for the treatment. Many AI platforms are being developed and approved by the US Food and Drug Administration for use in some areas of cancer, such as identifying suspicious lesions in cancer and interpretation of magnetic resonance imaging or computed tomography. Similarly, the Big Data to Knowledge (BD2K) initiative was launched by National Institute of Health to support the research and development of tools to integrate big data and data science into biomedical research. AI-guided clinical care has the potential to play an essential role in the screening, diagnosis and treatment of cancer.

**INTRODUCTION**

Cancer is a major public health problem and remains the second leading cause of death in the United States[1,2]. Early detection of cancer potentially enhances the chances for successful treatment and patient survival outcomes[1-3]. Prediction of early cancer and treatment response is a crucial issue in personalized treatment for cancer patients[4]. Artificial intelligence (AI), a field of computer science, aims to develop algorithms or computer programs with advanced analytical or predictive capabilities (Figure 1)[1,3,5]. Integration of AI technology into early detection of cancer could improve precision diagnosis, improve the clinical decision-making process, and lead to revolutionize the future of diagnostics and treatment[5,6].

AI innovation has the potential to affect several parameters of cancer therapy[5,6]. These include prediction, screening, analysis and interpretation of huge data sets, decoding tumor-imaging data, drug discovery and drug validation in a clinical setting[6,7]. Screening of tumor targets in both healthy and high-risk populations offers the opportunity to detect cancer early and with an improved recovery chance for treatment and cure (Figure 2)[7-9]. Advances in AI with machine learning and deep learning are rapidly evolving, and will soon change the science of cancer screening and detection[8,10]. There is a need to train cutting-edge AI technologies to predict early cancer in patients[5]. Although AI applications are still limited, the potential role of AI for early detection of cancer is huge to extract information on diagnosis, prognosis, and therapy responsiveness[5,11,12].

**AI IN EARLY DETECTION OF CANCER**

The precision algorithms of AI can be used to improve precision medicine to target the right patient for the right therapy at the right time[5,12,13]. The scoring of proliferation marker Ki-67 is highly relevant for early-stage breast cancer diagnosis, classification, prognosis, and treatment[2,4,7]. Automated brain tumor segmentation methods are computational algorithms that yield tumor delineation and have become an important diagnostic tool in planning precision medicine[4,7,14]. Accurate identification anddetection of lymph node metastasis are critical for planning treatments for colon cancer[2,4,15]. Given the complexities and heterogeneity within the cancer data, AI-based algorithms can be used for digitalized identification of histopathologic tumor specimens and image analysis (Figure 1)[4,10]. Gene mutation prediction and validation using raw input digitized histopathology give promising results for six different genetic mutations (STK11, EGFR, FAT1, SETBP1, KRAS, and TP53) in lung cancer[2,4,7,10]. Mutations in KRAS,tumor protein P53 and predictiveaccuracy of these markers can be used for early diagnosis of cancer[1,2,4]. Clinicians have utilized AI to establish an early signature (Programmed death-ligand 1), which could predict the effectiveness of cancer immunotherapy[1,13]**.**

Data analytics capabilities of AI have made a leap forward in recent years to predict cancer at its starting point[5,16,17]. Screening algorithms for cancer targets and processing data via AI will allow increased early detection and intervention[5,13,18]. Conventional cancer detection and treatment methods are expensive, time-consuming and often result in poor treatment outcomes[1,5,19]. To tackle this issue, the development of machine learning techniques is central to discovering novel biomarkers for early diagnostics[1,2,19]. Precise and early cancer diagnosis is fundamental for clinical management of cancer[2]. AI can accelerate drug discovery, harness biomarkers to accurately match patients to clinical trials, and truly personalize cancer therapy using only a patient's own data[2,5,20]. These advances are indicators that practice-changing cancer therapy empowered by AI may be on the horizon.

**AI IN CLINICAL DIAGNOSTICS**

The development of highly accurate AI algorithms for the early recognition of the disease is crucial not only for the rapid identification and diagnosis of cancer patients, but also for the treatment[6,21]. AI can be helpful in clinical diagnostics to ensure adequate patient care[6]. Useful screening tools to precisely diagnose cancer, such as mammography, radiology and image processing would improve the efficacy of clinical diagnostics[22]. The AI algorithms are already developed with large data sets that show improved diagnostics than clinicians[22]. AI-aided diagnostics for detecting cancer at heterogeneous and complex stage, showed effectiveness in various clinical datasets[22].

Many AI platforms are being developed and approved by the US Food and Drug Administration for use in some areas of cancer, such as for the identification of suspicious lesions in cancer and interpretation of magnetic resonance imaging or computed tomography[23,24]. There are several AI algorithms for the screening of cancer, for the identification of flagged areas in tumors, or treatment trends, and for the evaluation of big data sets[23]. For instance, there is an AI algorithm to visualize lung nodules in lung cancer patients and another AI algorithm to detectbreast abnormalities[25-27].

**AI AND NEW EMERGING TECHNOLOGIES**

Cutting-edge technologies such as AI are diffusing throughout the health-care system and reshaping patient care[15,28]. The volume of available data has grown exponentially, which can be used for early diagnosis and clinical decision-making process[5,15,28]. The revolution of AI in biomedical science is crucial to develop the concept of precision medicine[7,15]. Concurrent with the development of the field of precision medicine is an even larger revolution in understanding the events of early detection of cancer using digital technology[5,7]. AI in cancer has focused on risk prediction in the hopes of using risk information to influence health behaviors and treatment outcomes[4,7,15]. Understanding the science of early perdition in cancer offers tools and insights to help how to translate AI information into effective treatment (Figure 2)[4,18]. To date, AI has been used in many examples of clinical medicine[12,14]. For example, a smartphone app called DiagnosUs developed by AI technology for analyzing and annotating medical images and videos based on tight linkages between cancer prediction and patient treatment response[12,14,28].

AI could fuel everything from drug development to innovative design to new, better therapies[3,5,28]. Advanced analysis of big data with AI can make predictive modeling of biological processes transform research into development, and increase the accuracy to choose the right medication and dosage for complex diseases[5,28]. For example, the Google-backed company DeepMind has built a device that can diagnose different diseases in real-time[11,28]. It can be used for quick scan, diagnosis, and can detect early conditions such as diabetic retinopathy, age-related degeneration and cancer[11,28]. Similarly, the Big Data to Knowledge (BD2K) initiative was launched by National Institute of Health to support the research and development of tools to integrate big data and data science into biomedical research[11,29].

AI-guided clinical care has the potential to play an important role in screening, diagnosis and treatment of cancer[5,28]. The integration of AI technology into cancer care could further improve the accuracy and speed of diagnosis for better health outcomes[7,11,29]. Scientists trained computer algorithms to analyze patient images of prostate, breast and brain tumors[1,5,7,29]. It can be used at clinics as a tool to help with diagnosis, clinical decision-making and for the prediction of patient outcomes[1,29]. AI can predict commonly mutated genes, identify biomarkers, interpret complex images, and diagnose solutions for challenging types of cancer (Figure 2)[2].

**CONCLUSION**

AI has improved diagnosis and treatment outcomes in cancer patients[15]. AI can recognize patterns that can easily be missed by clinicians[10,15]. Cancer is an aggressive disease with a low survival rate, and the treatment process is lengthy and very costly[10]. Furthermore, the lack of large publicly available data sets, concerns over interpretation, lack of well-annotated databases, reproducibility and validation-issues have been significant barriers for AI practice and algorithm development[7]. There is a need to establish a central platform for sharing standardized cancer datasets to drive AI innovation[7]. In the near future AI can be integrated into a multitude of innovative emerging mobile health interfaces, such as digital technologies, smartphone apps and wearable devices, to develop real-time trackers for digital biomarkers that can explain, influence, and predict clinical outcomes[10,15,28].

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**Footnotes**

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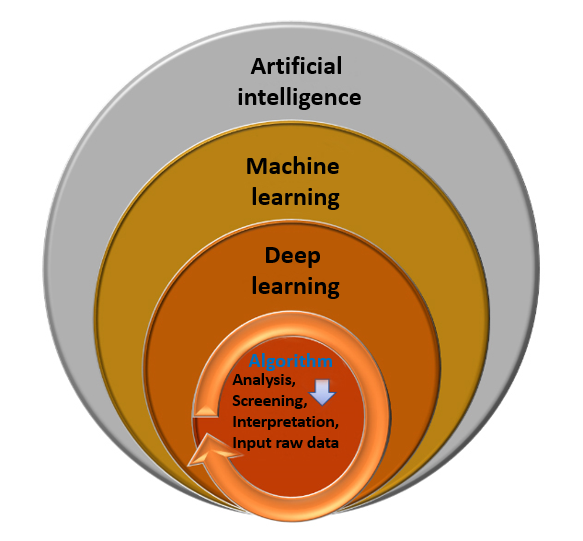
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Grade D (Fair): D

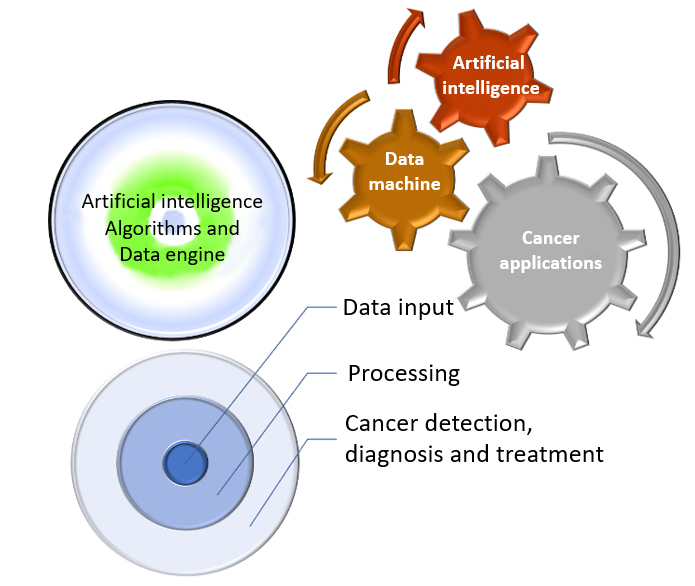
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**Figure Legends**



**Figure 1 Artificial intelligence (vehicle with innovative technology), machine learning (the engine that drives artificial intelligence) deep learning (the wave comes to healthcare), and raw data (feeding materials of the artificial intelligence engine).**



**Figure 2 Applications of artificial intelligence in tumor detection, diagnosis and treatment.**