

Exciting Advancements in Artificial Intelligence and Machine Learning for Type 2 Diabetes

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Abstract

Type 2 diabetes often referred to as adult-onset diabetes, is a chronic metabolic disorder characterized by elevated levels of blood sugar or glucose. This condition occurs when the body's cells become resistant to the effects of insulin, a hormone that regulates blood sugar levels. As a result, the pancreas must produce more insulin to compensate, leading to a state of hyperinsulinemia. Over time, the pancreas may struggle to keep up with this increased demand, and blood sugar levels can become uncontrolled. Hence it is obvious that Type 2 diabetes is a complex condition, also influenced by both genetic and lifestyle factors, such as diet, physical activity, and obesity. It is a significant global health concern, affecting millions of people worldwide. Left untreated or poorly managed, type 2 diabetes can lead to serious health complications, including heart disease, kidney problems, nerve damage, and vision impairment. Artificial Intelligence (AI) is a new and fast developing application tool to health care system, it can reform our approach to diagnosis and manage diabetes. Since much has been said and researched in the area of Diabetes, this article points to newer directions where application of Artificial Intelligence and Machine learning (AI and ML) can provide better diagnosis for this chronic illness. These newer search methods of compiling big data using AI and ML tools have shown great promise. The aim of this review is an attempt to better comprehend how AI and ML developments may be useful to individuals with diabetes. AI and ML approaches are being used to analyse vast datasets, such as electronic health records and genetic information, to identify novel risk factors to predict diabetes outcomes, and improve treatment strategies.

Keywords: Artificial intelligence (AI), Machine learning (ML), Diabetes, Disease prediction

Introduction

Artificial Intelligence (AI) and Machine Learning (ML) in Health care

In the ever-evolving landscape of healthcare, Artificial Intelligence (AI) and Machine Learning (ML) are becoming increasingly pivotal in the diagnosis, management, and treatment of chronic diseases¹. One such disease, Type 2 diabetes (T2D), has witnessed remarkable advancements thanks to these technologies. This review explores the thrilling progress and potential that AI and ML hold for the Type 2 diabetes landscape. For example T2D is also referred to as Metabolic Syndrome hence the metabolites produced by a cell, tissue or organs represent the endpoint of the omics process. Metabolomics workflows can be used to identify new and unknown compounds. Further risk assessment can be predicted using these modern tools such as ML and AI².

Exciting Frontiers in Early Detection:

The early detection of Type 2 diabetes is a game-changer, and AI and ML have risen to the challenge. Machine learning algorithms can sift through vast datasets, identifying subtle patterns and risk factors that may go unnoticed by traditional methods. These AI-powered systems enable healthcare professionals to make precise predictions about a patient's susceptibility to the disease, thereby facilitating early intervention and prevention strategies. In the case of T2D it is essential to understand the disease³ and search for potential biomarkers. This not only saves lives but also reduces the long-term burden on healthcare systems. ML algorithms can analyze patient data, such as medical records, genetic information, and lifestyle factors, to identify individuals at high risk of developing Type 2 Diabetes. AI can help in automating the analysis of medical images (e.g., retinal scans, MRI) to detect early signs of diabetes-related complications, like diabetic retinopathy. A complication due to long-term diabetic disease is shown in Figure-1 below:

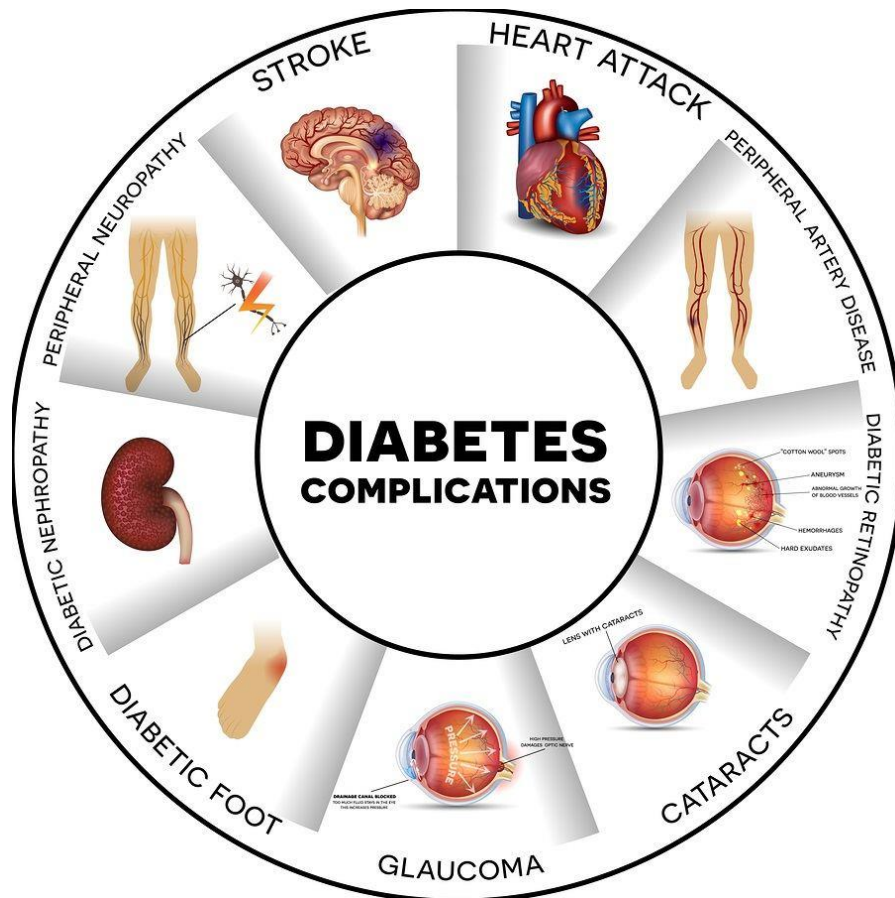


Figure-1: Source- Google Images of Diabetes, Showing the various complications due to diabetes.

Real-time Monitoring and decision support can be achieved through ML models which can continuously monitor patient data, providing real-time insights into their health status. Thus, decision support systems can assist healthcare professionals in adapting treatment plans based on evolving patient conditions.

Personalized Treatment Plans:

AI and ML have ushered in a new era of personalized medicine for Type 2 diabetes patients. By analyzing a patient's genetic makeup, lifestyle factors, and medical history, these technologies can tailor treatment plans to suit individual needs. Through continuous monitoring and real-time data analysis, AI-driven tools can adapt treatment strategies on the fly, ensuring optimal glycemic control and minimizing the risk of complications. The result is a remarkable improvement in the quality of life for those living with Type 2 diabetes. Diagnosis of type-2 diabetes and generating bigdata can set the stage for AI and build standards for best models in ML and AI⁴. ML can be used to tailor treatment plans for individuals based on their unique characteristics and responses to medications. This can help optimize blood sugar control and reduce the risk of side effects. AI-powered chatbots and virtual assistants can provide real-time advice and support to patients, helping them manage their condition more effectively. Patient support and their cooperation in building up AI programs and using ML techniques has been the backbone of this venture⁵. ML models can assess an individual's risk of developing certain diseases based on genetic and environmental factors. This information allows for proactive interventions and personalized prevention strategies.

Precision Medicine:

The traditional "one-size-fits-all" approach to managing Type 2 diabetes is rapidly becoming obsolete^{6,7,8}. AI and ML have enabled the development of precision medicine, where treatments are fine-tuned to each patient's specific requirements. This not only results in improved therapeutic outcomes but also minimizes side effects and complications, making management more effective and patient-centric. Researchers were increasingly focusing on individualized treatment and

prevention strategies based on a person's genetic and metabolic profile. This allows for more targeted and effective therapies for managing Type 2 diabetes. ML algorithms can help optimize insulin dosing regimens for individuals, taking into account factors like diet, activity level, and daily routines. AI can also assist in medication adherence by sending reminders and educational content to patients. Further, ML models can integrate and analyze diverse clinical data, including electronic health records (EHRs), imaging data, and patient histories.

Table-1: Showing the Building of a predictive model for a disease (Diabetes) using big data involves several steps. Presenting a high-level overview of the process:

Step	Description
1. Define the Problem	Clearly define the problem to be solved (e.g., predicting disease risk).
2. Gather Data	Collect a diverse dataset with relevant features, ensuring data quality and privacy compliance.
3. Data Preprocessing	Clean and preprocess the data, handling missing values, outliers, and inconsistencies.
4. Exploratory Data Analysis (EDA)	Analyze and visualize the data to understand patterns, correlations, and relationships.
5. Feature Engineering	Create or transform features to improve model performance.
6. Model Selection	Choose a suitable machine learning algorithm based on the problem and data characteristics.
7. Model Training	Split the dataset, train the model on the training set, and optimize hyperparameters.
8. Evaluation Metrics	Select appropriate metrics (e.g., accuracy, precision, recall, AUC-ROC) for model evaluation.
9. Model Interpretability	Ensure the model is interpretable, aligning with medical knowledge.
10. Validation and Testing	Perform cross-validation and test the model on new, unseen data for generalization.
11. Deployment	Deploy the model in a real-world setting with monitoring mechanisms.
12. Continuous Improvement	Regularly update the model with new data, monitor performance, and retrain as needed.

Important consideration include: Ethical and Regulatory Compliance standards and healthcare regulations, besides protecting sensitive patient information. At every step involvement healthcare experts for clinical relevance is utmost important. By considering multiple data sources, AI can provide a comprehensive view of an individual's health status and help in making more informed treatment decisions. This enables the identification of the most effective and least harmful treatments for individual patients, reducing trial and error in treatment selection.

Predictive Analytics:

Predictive analytics powered by AI and ML have revolutionized the management of Type 2 diabetes. By continuously monitoring vital health parameters, these systems can predict glucose fluctuations and other critical events well in advance. This enables patients and healthcare professionals to take proactive measures, thus averting crises and preventing complications⁹. This technology has the potential to transform the way we manage diabetes, ensuring better health outcomes and reduced hospitalization rates. ML models can forecast blood sugar levels and the risk of complications, allowing healthcare providers to intervene proactively. Building predictive models has been a mammoth task, but much success has been achieved with scope for further improvement¹⁰.

Table-2: Outlining the impact of predictive analytics powered by AI and ML on the management of Type 2 diabetes:

Aspect	Description
Early Detection and Diagnosis	Predictive analytics enable early identification of individuals at risk of developing Type 2 diabetes based on various factors such as genetics, lifestyle, and health data. This allows for timely intervention and preventive measures.
Personalized Treatment Plans	AI and ML algorithms analyze patient data to create personalized treatment plans, considering factors like blood glucose levels, lifestyle, and medication response. This tailored approach improves the effectiveness of diabetes management.
Continuous Monitoring	Smart devices and wearables equipped with AI-powered analytics provide real-time monitoring of glucose levels, physical activity, and other relevant metrics. This continuous feedback helps patients and healthcare providers make informed decisions.
Risk Stratification	Predictive models stratify patients based on their risk of complications, allowing healthcare professionals to prioritize resources and interventions for those at higher risk, thus optimizing healthcare delivery.
Improved Medication Adherence	AI applications can predict patient adherence to medication regimens by analyzing historical data and patterns. This insight allows healthcare providers to address non-adherence issues promptly, improving overall treatment outcomes.
Lifestyle Recommendations	AI-driven analytics consider lifestyle factors such as diet and exercise habits to offer personalized recommendations. This holistic approach supports patients in making sustainable lifestyle changes to better manage their diabetes.
Data-Driven Insights for Healthcare Providers	Healthcare professionals benefit from AI-generated insights, facilitating data-driven decision-making. Predictive analytics assist in identifying trends, optimizing resource allocation, and improving overall patient outcomes.

Some models can also predict the impact of lifestyle changes (e.g., diet and exercise) on blood sugar control. Further, building new models using big data for kidney disease or other diseases is predicted¹¹.

Enhanced Patient Engagement:

One of the most exciting aspects of AI and ML in Type 2 diabetes is their ability to engage patients actively in their care. Through wearable devices, smartphone apps, and patient portals, individuals can monitor their health and receive real-time feedback. This engagement not only motivates patients to adhere to their treatment plans but also fosters a sense of empowerment and autonomy in managing their condition. AI has significant potential to improve screening, diagnosis, and management of patients with diabetes. Wearable devices and continuous glucose monitors can collect real-time data, which AI can analyze to provide alerts for both patients and healthcare providers when blood sugar levels are out of range. AI can also detect patterns in glucose data, helping to identify trends and potential causes of blood sugar fluctuations. AI can analyze a patient's dietary choices and physical activity to offer personalized recommendations for healthier habits. Mobile apps can help individuals track their food intake, exercise, and other lifestyle factors and provide guidance based on this data. Most importantly, AI can contribute to ensuring the security and privacy of patient data, a crucial aspect of precision medicine where sensitive information is involved.

Data Integration and Electronic Health Records (EHR):

AI can accelerate drug discovery by analyzing vast datasets to identify potential targets, biomarkers, and novel therapeutic compounds for diabetes. ML can optimize clinical trial design and patient selection, potentially speeding up the development of new treatments. AI can help integrate and make sense of vast amounts of patient data from electronic health records,

facilitating research and patient care¹². Hence what we foresee has been beautifully described taking into consideration the role of endocrine or the hormonal status in diabetics¹³. It can assist in identifying relationships between various health parameters and diabetes outcomes.

Remote Monitoring:

Telemedicine platforms, often utilizing AI for remote monitoring, enable healthcare providers to track patients' progress and intervene as necessary, reducing the need for frequent in-person visits. AI and ML have the potential to significantly enhance our understanding of Type 2 Diabetes, improve patient outcomes, and streamline healthcare processes. High performance tools like ML and AI are in, and new modes of treatment plans are at our door step¹⁴ medical. However, it's crucial to ensure that these technologies are integrated into healthcare systems with appropriate data privacy and security measures, and that they are validated through rigorous clinical trials to ensure their safety and effectiveness. The future of diabetic care is around the corner¹⁵.

Conclusion:

The integration of Artificial Intelligence and Machine Learning in the realm of Type 2 diabetes is nothing short of thrilling¹⁵. The promise of early detection, personalized treatment plans, precision medicine, predictive analytics, and enhanced patient engagement is transforming the landscape of diabetes care. These technologies have the potential to improve the quality of life for millions of individuals living with Type 2 diabetes and alleviate the burden on healthcare systems worldwide. As AI and ML continue to evolve, the future holds exciting prospects for more efficient, effective, and patient-centred diabetes management. AI and ML applications have the capabilities to transform diabetes care and help millions of diabetic people to achieve better blood glucose control, reduce hypoglycemic episodes, and reduce diabetes comorbidities and complications. AI applications offer greater accuracy, efficiency, ease of use. Artificial Intelligence (AI) and Machine Learning (ML) can be valuable tools for understanding and managing Type 2 Diabetes. In fact, it's a boon to the patients and their physicians and family members and gives them complete satisfaction. By considering multiple data sources, AI can provide a comprehensive view of an individual's health status and help in making more informed treatment decisions.

Declarations

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