

A paradigm of modern drug delivery and artificial intelligence

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The confluence of artificial intelligence (AI) and big data in the field of pharmaceuticals has engendered a paradigm shift, culminating in the emergence of computational pharmaceuticals. This avant-garde discipline leverages the unparalleled capabilities of AI algorithms and machine learning to dissect, scrutinize, and prognosticate the multifaceted intricacies of pharmaceutical data. By so doing, computational pharmaceuticals endows researchers with the capacity to simulate drug formulation and delivery processes, obviating the necessity for protracted trial-and-error iterations. This remarkable transformation expedites the drug development continuum, affords substantial cost ameliorations, and augments overall research efficiency, transgressing scales that encompass molecular interactions to macroscopic phenomena [1, 2].

In the arena of pharmaceutical science, AI exerts its prowess in the development of oral solid dosage forms, with a particular proclivity for tablets, the linchpin of the pharmaceutical marketplace. It diligently partakes in the formulation process and elucidation of the nuanced attributes inherent in these tablets. Employing a repertoire of AI technologies, such as artificial neural networks (ANNs), fuzzy logics, neural networks, and genetic algorithms, AI orchestrates the prediction of outcomes and streamlines the processing and operational facets. Furthermore, AI assists in the prognostication of drug release profiles and the discernment of the pertinacious impacts of pivotal processing parameters. In the realm of 3D-printed dosage forms, AI algorithms optimize the design and formulation in accordance with patient-specific variables. This superlative technology combs through extensive datasets, simulating behavioral responses, thereby facilitating expeditious prototyping and optimization of drug release profiles, dosage potencies, and geometrical parameters. The assimilation of AI-driven feedback systems ensures an evolutionary refinement of the 3D-printing process by perpetually imbibing real-time data, thereby endowing it with precision, repeatability, and scalability. The application of AI doesn't cease here; it has metamorphosed the landscape of quality control processes in pharmaceutical manufacturing through its adeptness in the detection of tablet defects. AI algorithms, in concert with computer vision techniques, mechanize the identification of imperfections such as fractures, fissures, discoloration, and deviations in shape. Through the tutelage of labeled images, AI models achieve a zenith of precision and recall. The amalgamation of deep learning with X-ray tomography enhances the acumen of defect detection, profoundly truncating time, mitigating expenses, and diminishing the

workloads heretofore incurred. AI also emerges as an indispensable tool for the prediction of the physicochemical stability of oral dosage forms. Here, machine learning algorithms draw on copious datasets to prognosticate stability predicated on drug attributes, formulation parameters, and environmental exigencies. This auspiciously aids in the premature detection of potential stability issues, fostering the optimization of formulation designs and the ultimate bestowal of pharmaceutical agents that are not only efficacious but also benign to human physiology. In addition, AI contributes to the prescience of dissolution rates, an elemental parameter that reverberates in the domain of drug bioavailability and therapeutic efficacy. AI models meticulously dissect empirical data to ferret out properties that exert influence on the dissolution process, conferring invaluable insights into the crafting of more potent drug delivery systems. This, in turn, empowers pharmaceutical scientists to hasten the drug development saga and elevate the standards of patient care [3, 4].

Within the precincts of nanomedicine, AI assumes an unequivocal mantle of leadership, expeditiously propelling the development of interventions executed on the nanoscale, enhancing diagnostic protocols, drug dispensation mechanisms, and the realm of personalized medicine. AI lends a discerning hand in the aegis of the design and optimization of nanoparticles, foretelling their inherent attributes, stability, and efficacious potential. In a syncretic endeavor, AI models appraise the interactions engendered by nanoscale materials within the intricate milieu of biological systems, projecting their behavioral propensities and toxicity. AI-integrated sensors catalyze real-time surveillance of critical biomarkers, drug concentrations, and the tempo of pathological progression, furnishing fertile ground for judicious and expeditious medical interventions. The overarching dominion of AI extends to nanocarrier drug delivery systems, culminating in the streamlining of the optimization process and compatibility assessment of nanocarriers with therapeutic agents. The utilization of computational methodologies obviates the necessity for repetitive experimentation, and AI-driven repositories serve as invaluable resources for probing the intricate interplay between nanocarrier configurations and an eclectic array of properties. Furthermore, AI assumes an influential role in unraveling the mysteries shrouding the delivery efficacy of nanoparticle-based drug dispensation systems to the citadels of malignancy. This concerted effort ushers in epochal discoveries that underpin a more incisive assessment of cancer therapeutics and aids in surmounting the obstacles

intertwined with the delivery of therapeutic payloads via nanoparticles [5].

AI emerges as an avant-garde force revolutionizing the annals of pharmaceuticals, with a particular focus on the development and production of intricate formulations such as injectables and biologics. It stands as a sentinel in the sphere of prognostication and optimization of physicochemical parameters, thereby ensconcing the stability of parenteral formulations in an imperturbable aegis. AI algorithms unfailingly parse real-time process data, discerning the myriad factors that influence the quality of pharmaceutical products (table 1). This acumen is a harbinger of enhanced consistency and augmented productivity across the industrial spectrum. Moreover, AI seamlessly integrates into the purview of quality assurance, where it detects and rectifies concerns that might imperil the integrity of the production pipeline at an incipient stage, thereby ensuring product quality in the long run. AI-equipped monitoring systems anatomize critical process parameters in real-time, enabling swift interventions in case of deviations, which, in turn, safeguard product integrity and compliance with stringent regulatory standards. Furthermore, AI assumes a cardinal role in the optimization of maintenance procedures for manufacturing equipment, curtailing downtime and embellishing production yields. By dint of its analytical acumen, AI deftly navigates the labyrinthine landscape of process data and product attributes, thereby serving as an invaluable ally in the domains of good manufacturing practices (GMP) and regulatory compliance. In the domain of pharmaceutical and materials science, the promise of machine learning technologies, exemplified by tree-based models like LGBM, holds the potential for the swifter realization of in vitro drug release from long-acting injectables. This heralds a more sophisticated and tailored approach to the construction of intricate drug delivery systems. The recent strides in computational pharmaceuticals, bolstered by machine learning and multiscale simulations, have wrought a transformative upheaval in the development of ocular, transdermal, pulmonary, and other mucosal drug delivery systems. In silico modeling and simulations unfurl elaborate insights that expedite a rational formulation design, banishing the erstwhile omnipresent specter of traditional trial-and-error techniques. The synergy between in silico methodologies and interdisciplinary collaborations acts as a lodestar, steering the compass towards more resource-efficient and goal-oriented drug formulation design in the epoch of Pharma 4.0. Within the precincts of biologics product development, AI assumes an irreplaceable mantle of stewardship. It possesses the unique potential to craft proteins, peptides, nucleic acid biologics, and immunotherapeutics endowed with the quintessential attributes deemed vital for therapeutic efficacy. By sifting through vast repositories of protein structure and function data, AI algorithms delineate therapeutic sequences brimming with enhanced stability, binding affinity, and immunogenic safety, thereby conferring bespoke biologics poised to usher in superior therapeutic outcomes [6].

Furthermore, AI aids in the unearthing of therapeutic targets, marshaling the troves of genetic, proteomic, and clinical data to underpin the development of protein and

peptide biologics specifically tailored to combat disease-causing proteins or orchestrate transformative alterations in biological pathways. In a feat of computational wizardry, AI unfurls the enigma of protein folding, extracting predictive insights from amino acid sequences—an indispensable rubric for comprehending protein function and molding resilient and operative biologics. AI algorithms wield the faculty to foresee the binding affinity between proteins or peptides and target molecules, thereby enabling the selection or fabrication of biologics endowed with prodigious affinity and exquisite specificity for their intended targets. Moreover, AI extends its tutelage to the optimization of the formulation of protein and peptide biologics, being meticulous in its consideration of factors like stability, propensity for aggregation, and the interplay of various formulation components. AI further assumes the solemn duty of predicting the toxicity potential of protein and peptide biologics, unmasking harmful sequences or configurations for the purpose of prompt identification and judicious modification. AI's mantle of influence also encompasses the optimization of clinical trials for biologics, guided by its capacity to predict patient responses and refine trial protocols on the basis of patient data, the peculiarities of the disease under consideration, and the projected treatment outcomes [7].

Within the realm of medical devices, AI orchestrates a tectonic shift in the healthcare landscape, wielding its potency to facilitate diagnostics, engender remote monitoring capabilities, and augment the functionality of wearable devices. It also seamlessly ingrains itself in the domains of prosthetics, surgical instruments, and medication management systems, culminating in a palpable improvement in patient outcomes and the delivery of personalized care. The amalgamation of AI within the domains of pharmaceuticals and healthcare has bequeathed the epoch with a veritable fount of innovation and efficiency. Computational pharmaceuticals, galvanized by the omnipotence of AI and the sheer magnitude of big data, has charted an unprecedented course in the exploration of drug development. It serves as a beacon that lights the path towards a future marked by expedited timelines, cost abatement, and heightened productivity. Through the prism of multiscale modeling and machine learning algorithms, it has bestowed upon researchers the capacity to navigate the labyrinthine intricacies of drug formulation and delivery, ushering in a new era where the wrath of protracted trial-and-error experiments has been exorcised. AI's omnipresence extends beyond the precincts of traditional oral solid dosage forms, ensconcing an indomitable dominion over 3D-printed dosage forms and the avant-garde field of nanomedicine. It bequeaths an unwavering focus on the precision design and optimization of drug delivery systems, leading to therapies that are both more efficacious and exquisitely targeted. Furthermore, AI's ability to detect tablet defects and predict the physicochemical stability of pharmaceuticals augments product quality and guarantees patient safety. In the domain of biologics, AI emerges as the harbinger of transformation, meticulously sculpting proteins, peptides, nucleic acid biologics, and immunotherapeutics that encapsulate the essence of therapeutic excellence. By analyzing the colossal

volumes of data, AI algorithms generate therapeutic sequences characterized by enhanced stability, binding affinity, and an impeccable safety profile. The symphony of AI extends its sway to target identification, protein folding prediction, toxicity assessment, and clinical trial optimization. Medical devices, now infused with the omniscience of AI, have revolutionized the landscape of healthcare delivery. They unfurl a tapestry where

diagnostics, remote monitoring, and personalized care coalesce into a crescendo of effectiveness and tailored patient interventions. Wearable devices, prosthetics, surgical aids, and medication management tools have all been elevated by AI, culminating in a healthcare panorama that is characterized by therapies that are both more effective and tailored to the unique exigencies of each patient.

Table 1. AI advancements transforming the pharmaceutical landscape

Application	Description	Benefits
Computational Pharmaceuticals	Integration of AI and big data for drug development and optimization. Simulates drug formulation and delivery processes.	Accelerated drug development, cost reduction, increased productivity.
Oral Solid Dosage Forms	AI technologies like ANN, fuzzy logic, neural networks, and genetic algorithms predict outcomes, drug release profiles, and optimize tablet formulation.	Improved tablet design and quality, faster development.
3D-Printed Dosage Forms	AI algorithms optimize design and formulation based on patient-specific factors. Analyze datasets for rapid prototyping and drug release optimization.	Tailored drug delivery, faster development, improved quality.
Tablet Defect Detection	AI and computer vision automate the identification of tablet defects, improving quality control.	Faster and more accurate defect identification, cost reduction.
Physicochemical Stability	Machine learning predicts drug stability based on properties and environmental conditions, aiding in formulation design.	Early identification of stability issues, safer medications.
Dissolution Rates	AI models analyze data to identify factors influencing dissolution processes, enhancing drug delivery system design.	More effective drug delivery, faster development.
Nanomedicine	AI optimizes nanoparticles, predicts properties, stability, and toxicity. AI-based sensors monitor biomarkers and enable precision drug delivery.	Improved diagnostics, targeted drug delivery, enhanced safety.
Biologics Development	AI designs proteins, peptides, and nucleic acid biologics with enhanced properties. Predicts toxicity, assists in clinical trial optimization.	Customized, safer biologics, faster development.
Medical Devices	AI enhances diagnostics, remote monitoring, and wearable devices. It aids in prosthetics, surgical tools, and medication management systems.	Improved patient care, enhanced diagnostics, and device functionality.

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