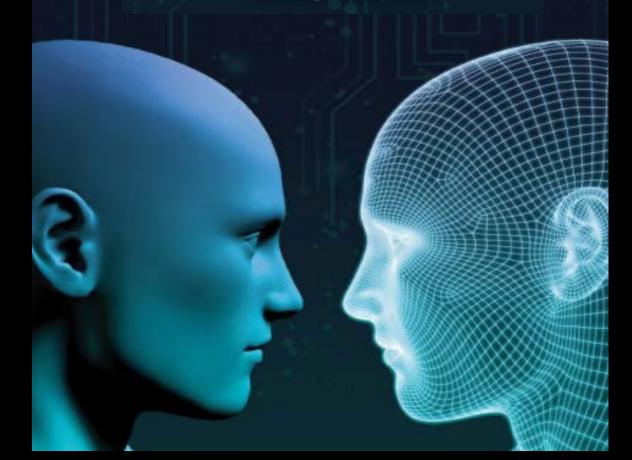


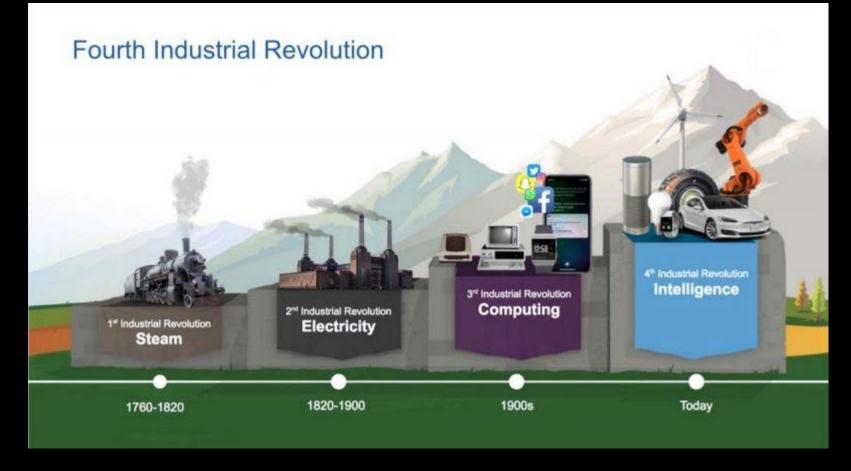
### The Digital Twin in Clinical Endocrinology

Iraj Nabipour, MD Bushehr University of Medical Sciences

### DIGITAL TWIN A REVOLUTION IN MEDICINE

**Dr. Iraj Nabipour** 





These advances are merging the physical, digital and biological worlds in ways that create both huge promise and potential peril.



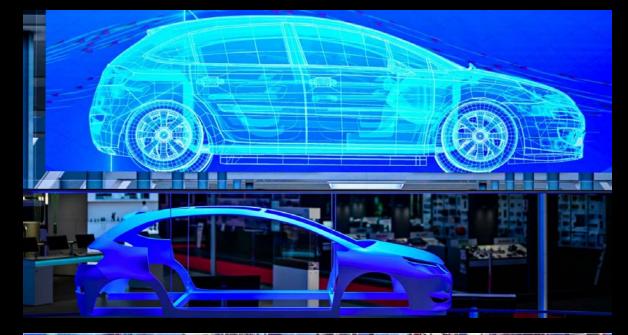
The concept of a physical twin, a precursor to Digital twin, is rather old and dates to NASA's Apollo

program.

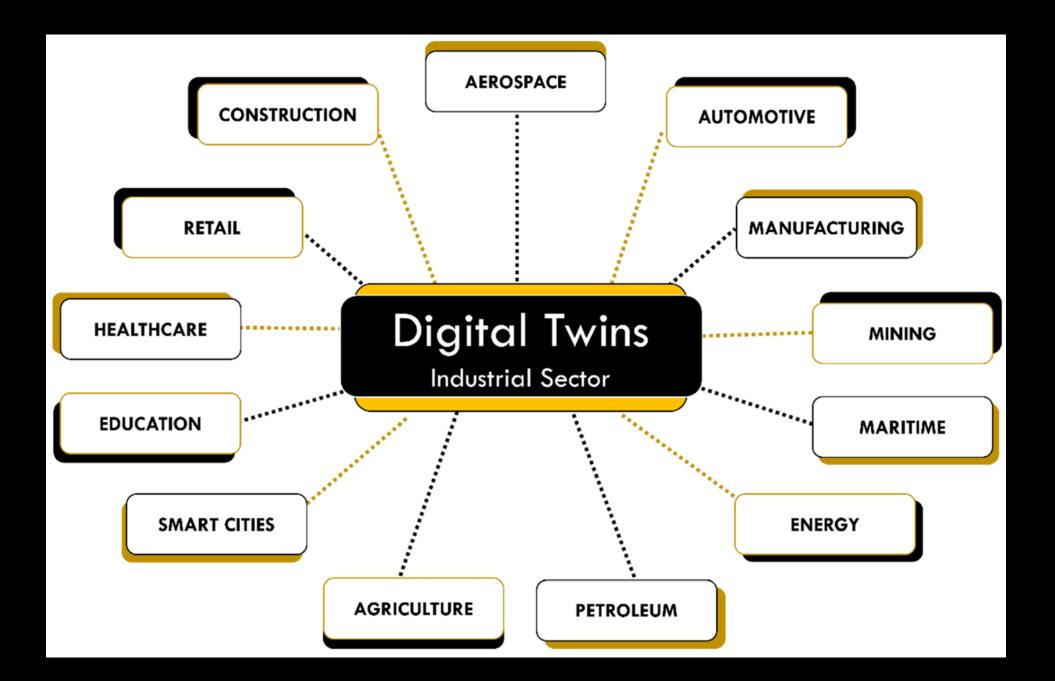


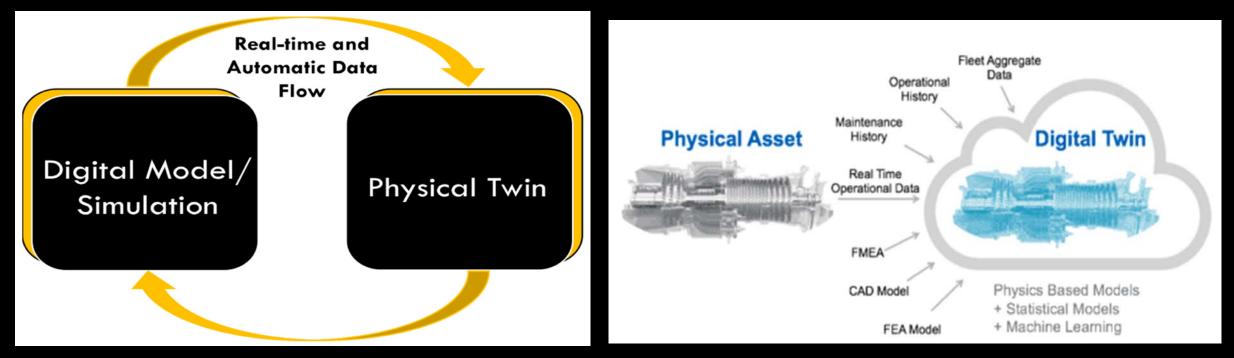








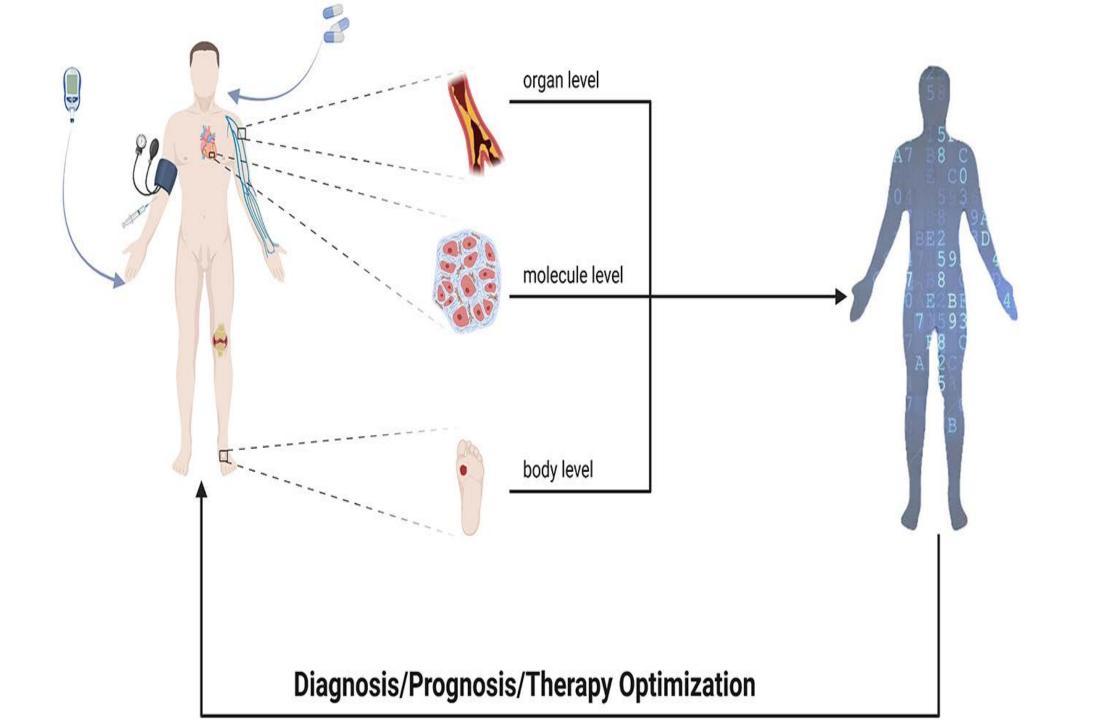


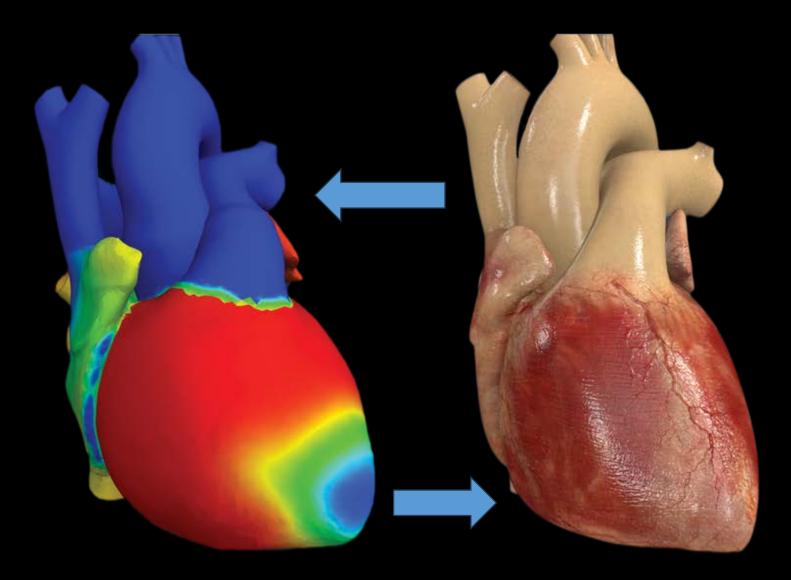


Physical twin: A real-world entity (living/non-living) such as part/product, machine, process, organization, or human, etc.
(ii)

2. Digital twin: The digital representation of the physical twin with the capability to mimic/mirror its physical counterpart in real time. (iii)

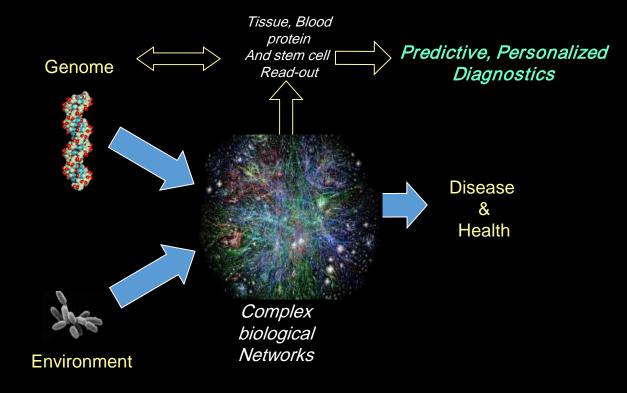
3. Linking mechanism: The bidirectional flow of data between the two which operates automatically in real-time.





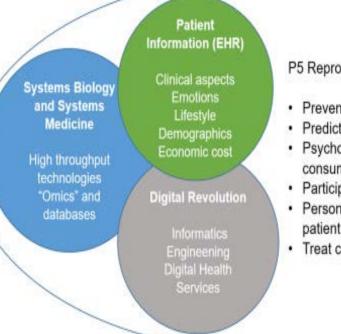


#### There are two types of Biological Information



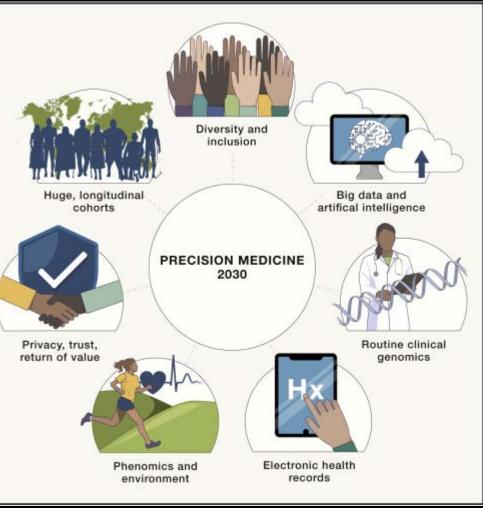
**Early 19th century** Lesions of organs and tissues Caseating granulomata

18th century Sick person Phthisis Late 19th century Lesions of cells and microbes M. tuberculosis Late 20th century Lesions detected at molecular level Interferon testing **21st century** The challenge of reassembly

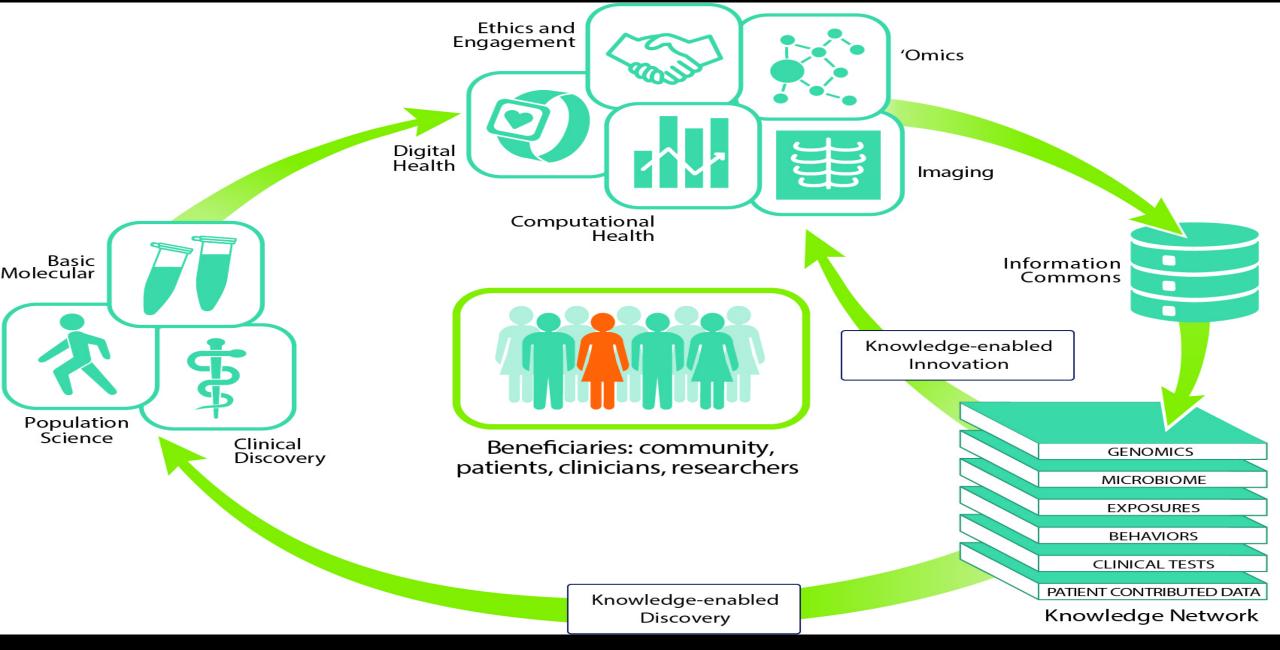


P5 Reproductive Medicine Approach

- Preventive and wellness focuses
- Predictive
- Psycho-cognitive aspects considered: consumer driven
- Participatory: patient as decision-maker
- · Personalized: utilization of big data for patient stratification.
- · Treat causes and not symptoms

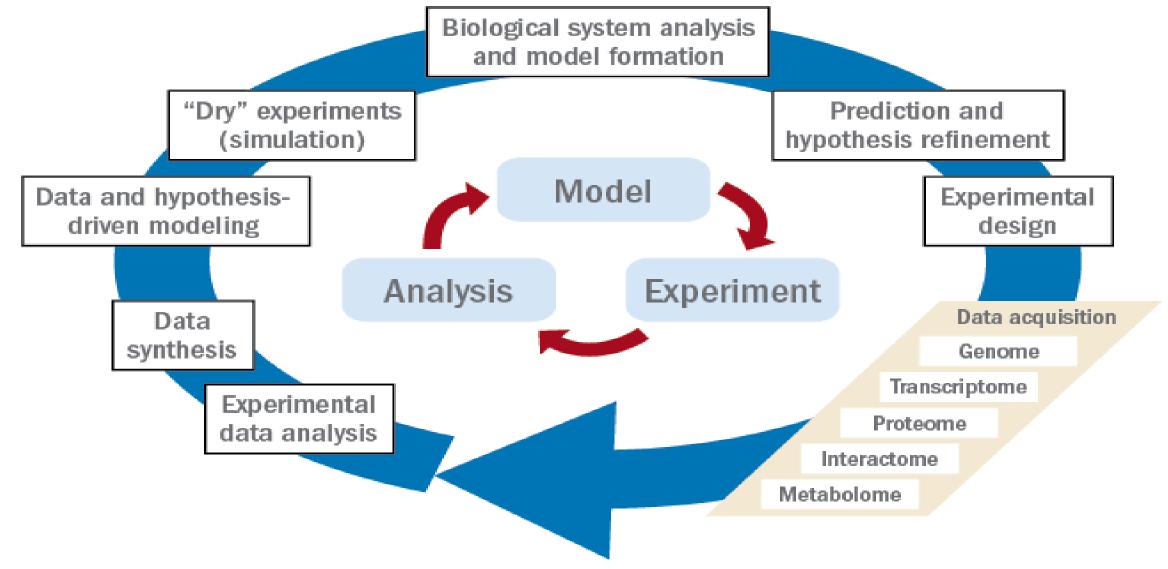


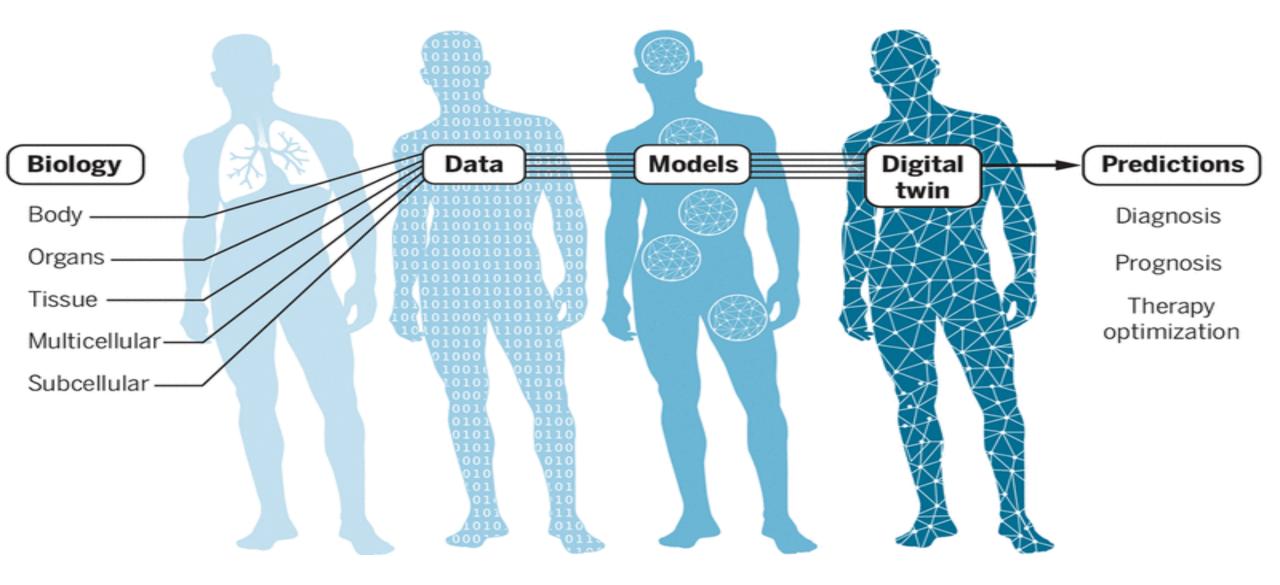
Systems medicine is defined as the application of the systems approach to the prevention of, understanding and modulation of, and recovery from developmental disorders and pathological processes in human health (Clermont et al. 2009).

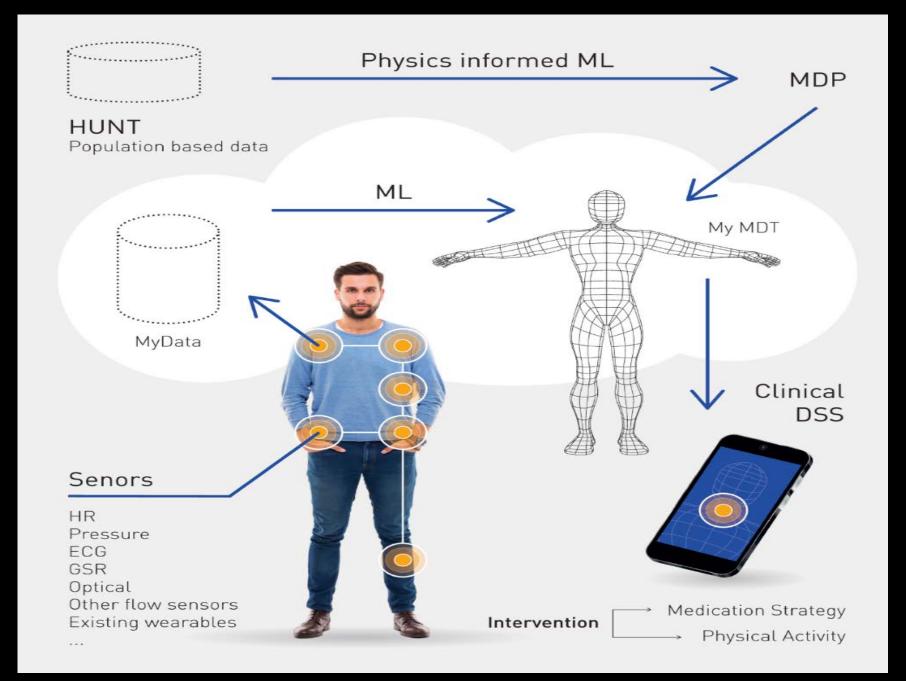


"Precision medicine is an emerging approach for disease treatment and prevention that takes into account individual variability in genes, environment, and lifestyle for each person."

### The process of systems biology research













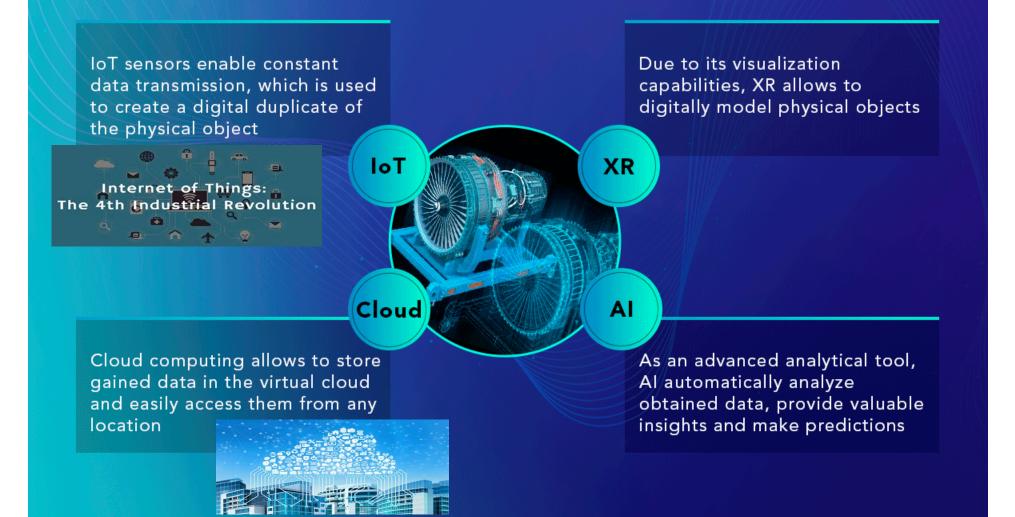








#### **TECHNOLOGIES USED IN DIGITAL TWINS**



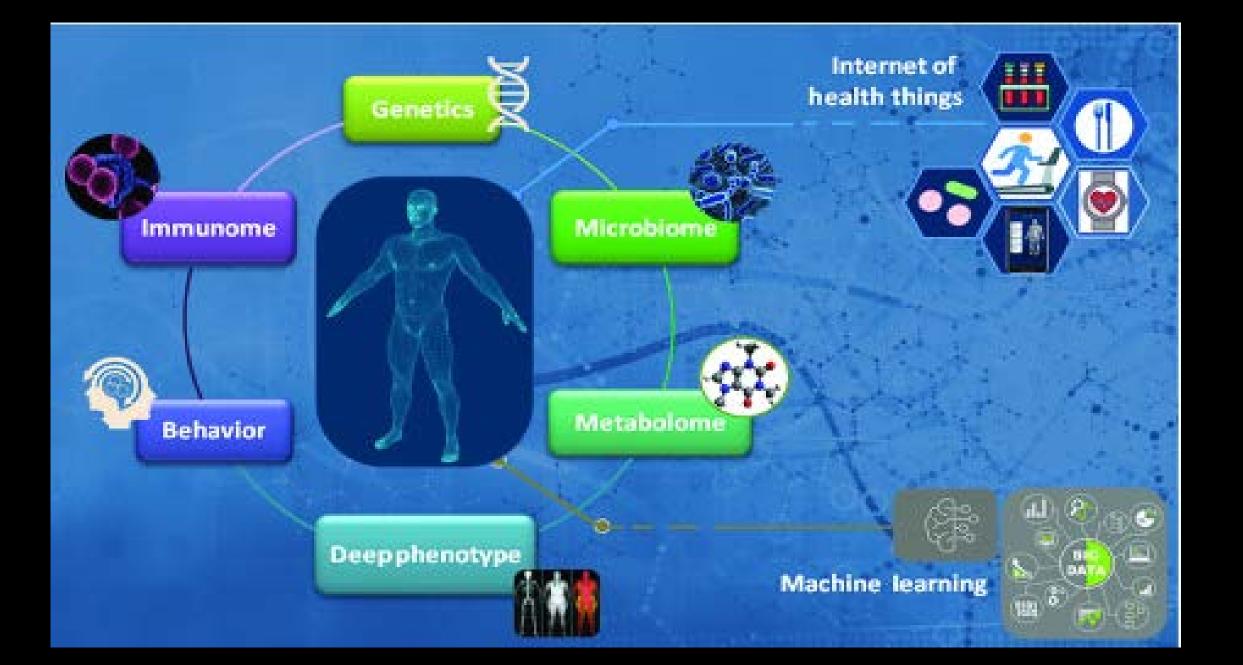
## DEEP MEDICINE

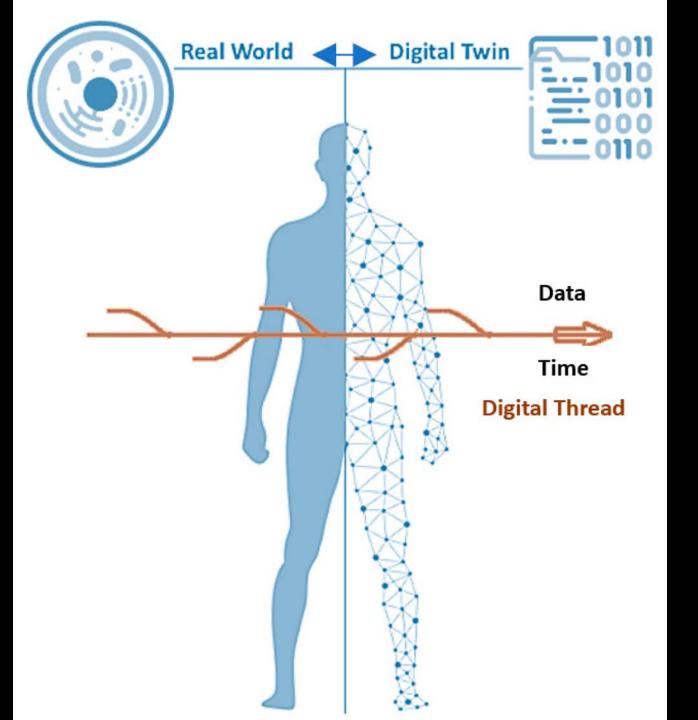
HOW ARTIFICIAL INTELLIGENCE CAN MAKE HEALTHCARE HUMAN AGAIN

#### ERIC TOPOL, MD

With a foreword by ABRAHAM VERGHESE, author of Cutting for Stone

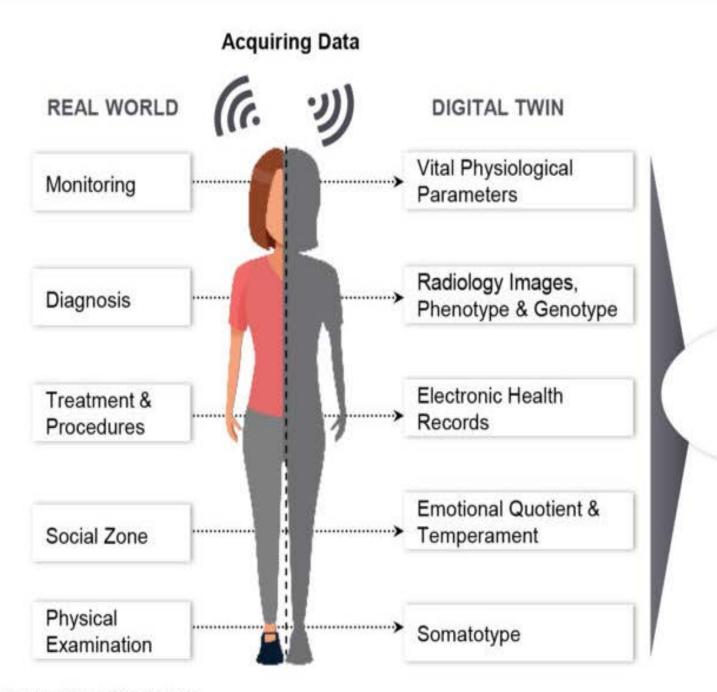












Applications

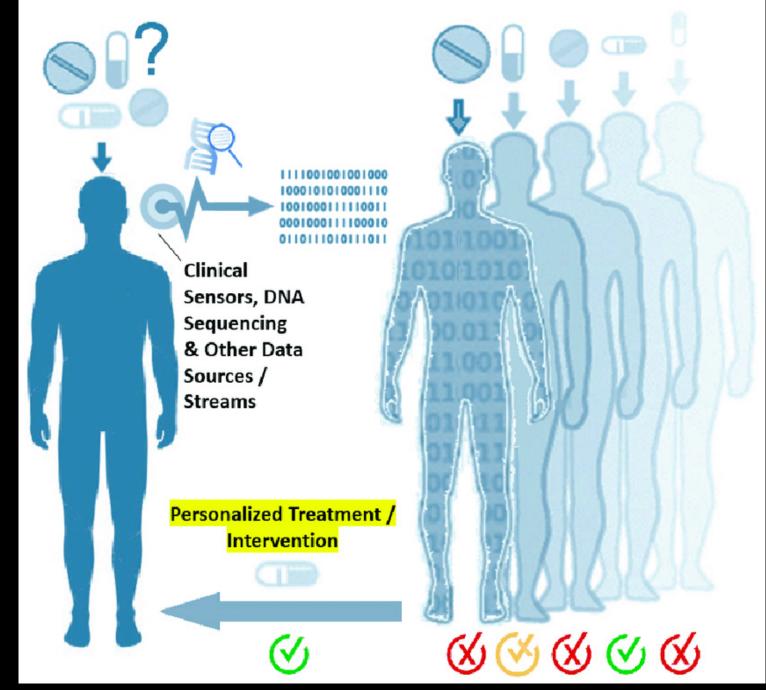
**Predictive Outcome** 

**Surgical Planning** 

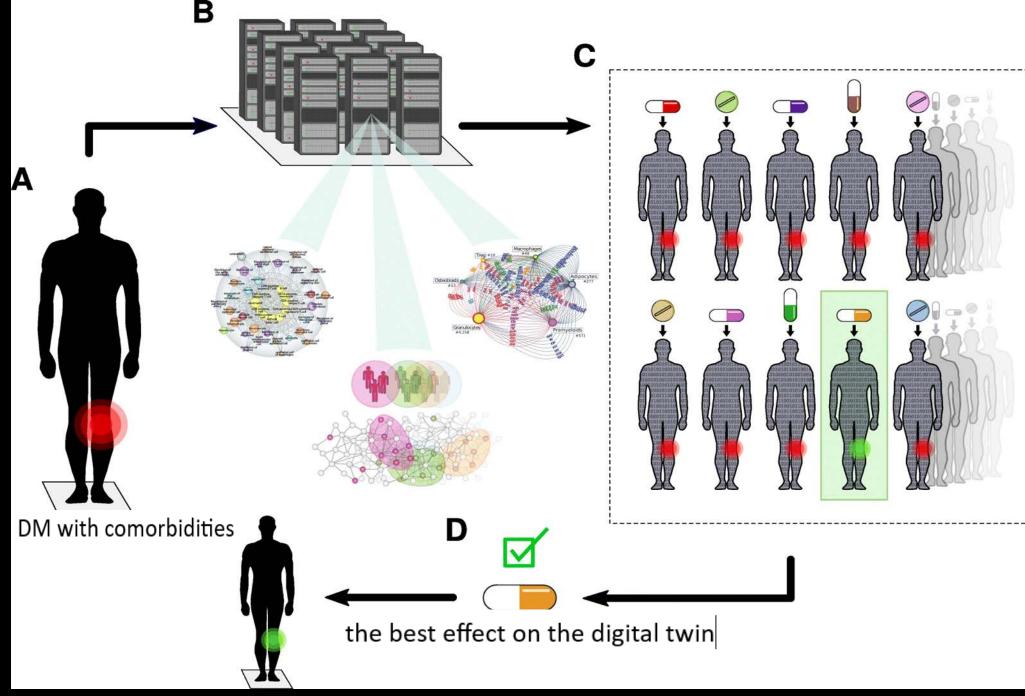
Personalized Medicine

Medical Education & Training

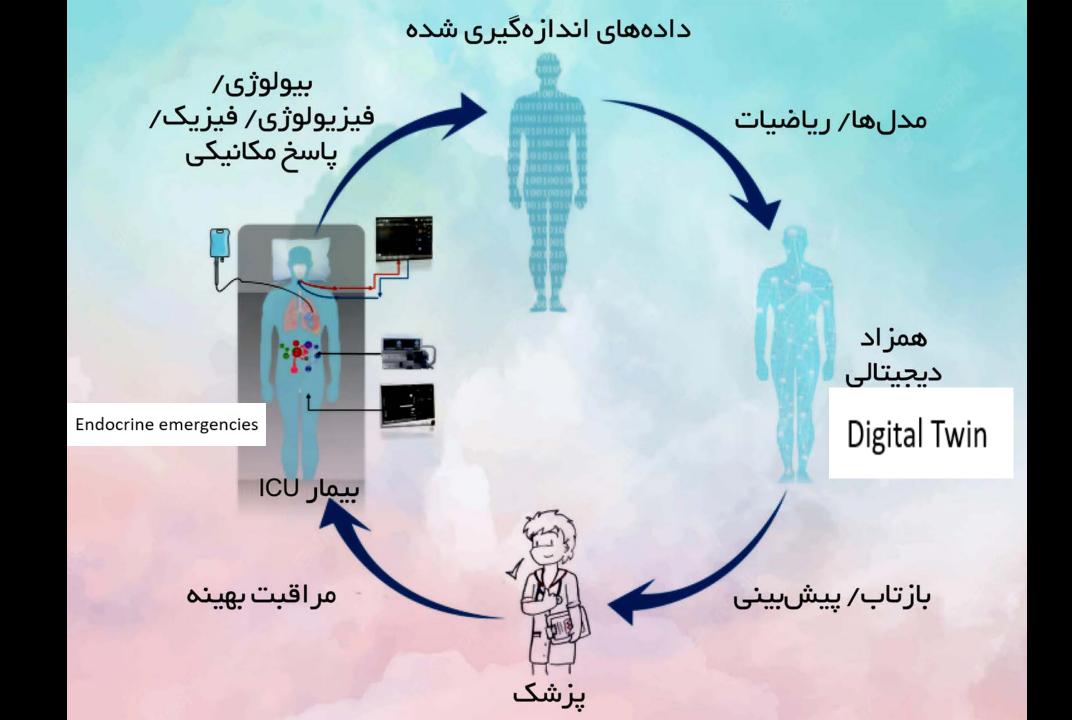
Source: FutureBridge Analysis

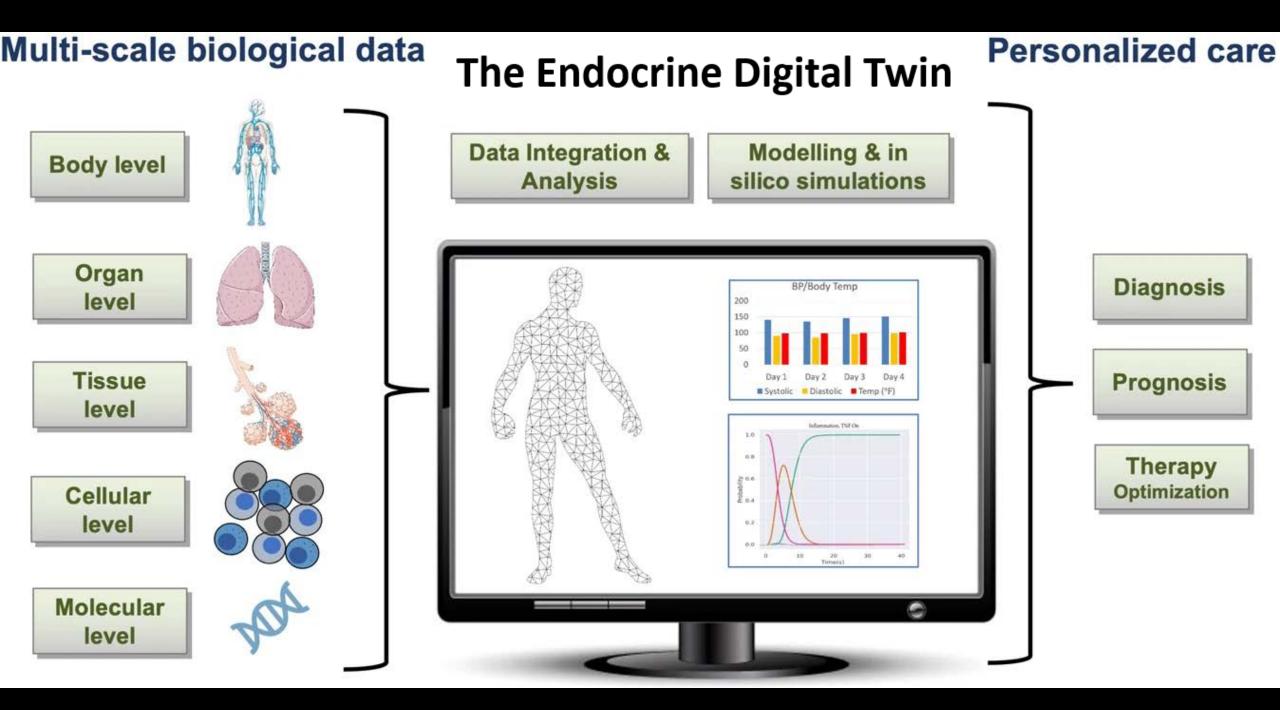


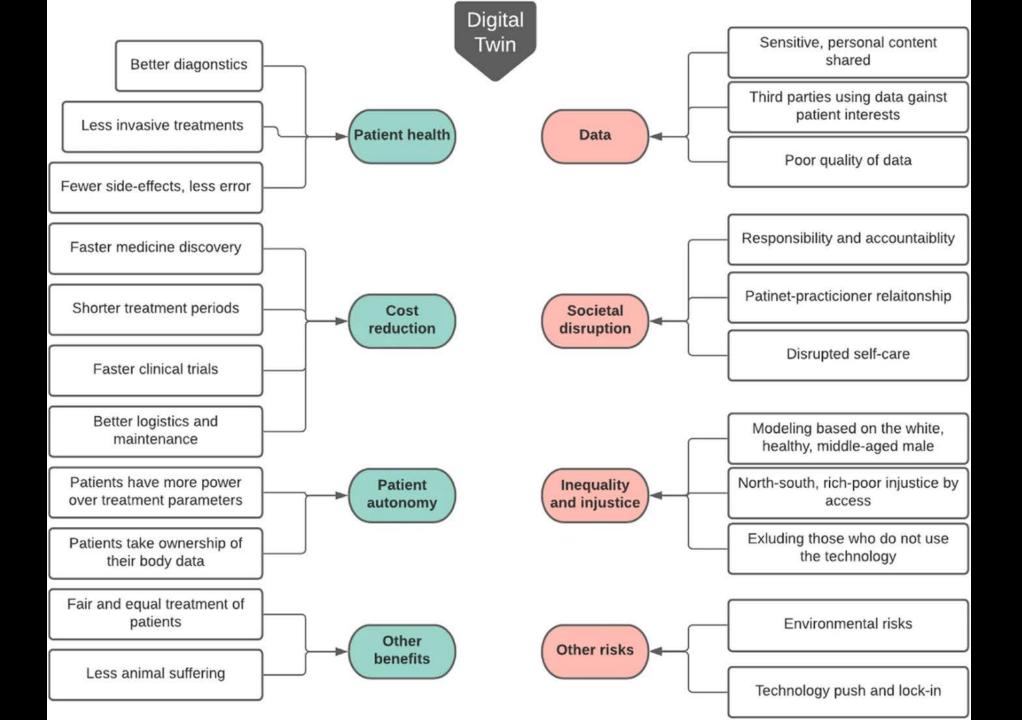
The digital twin concept for personalized medicine.

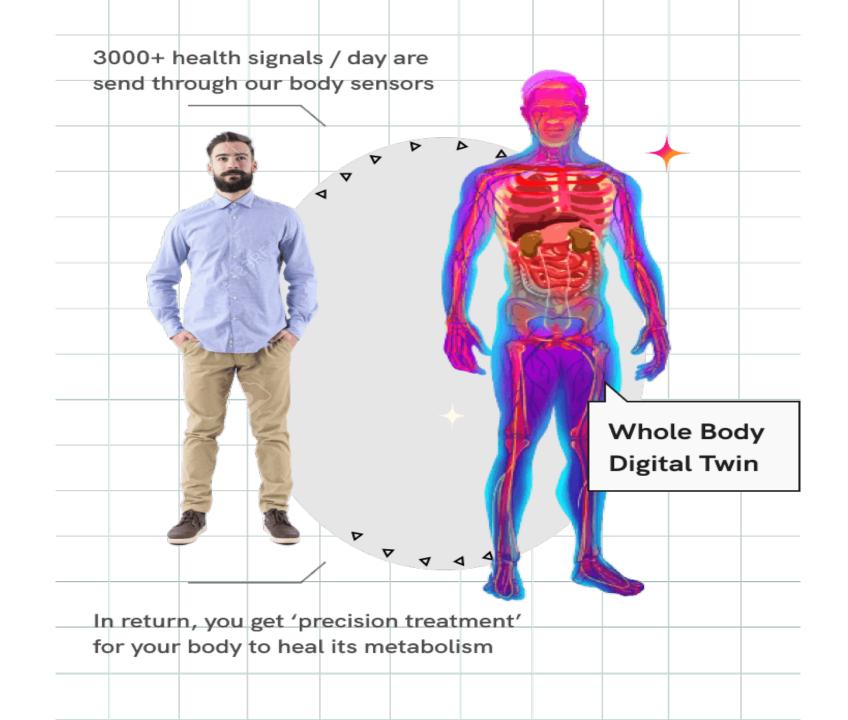


The digital twin concept for personalized medicine.









# The Artificial Intelligence-based Whole Digital Twin for diabetes remission



 A more recent 2021 ADA consensus statement defined diabetes remission as HbA1c<6.5% at least 3 months after stopping glucose-lowering pharmacotherapy. Shamanna et al. Clin Diabetes Endocrinol (2021) 7:21 https://doi.org/10.1186/s40842-021-00134-7

Clinical Diabetes and Endocrinology

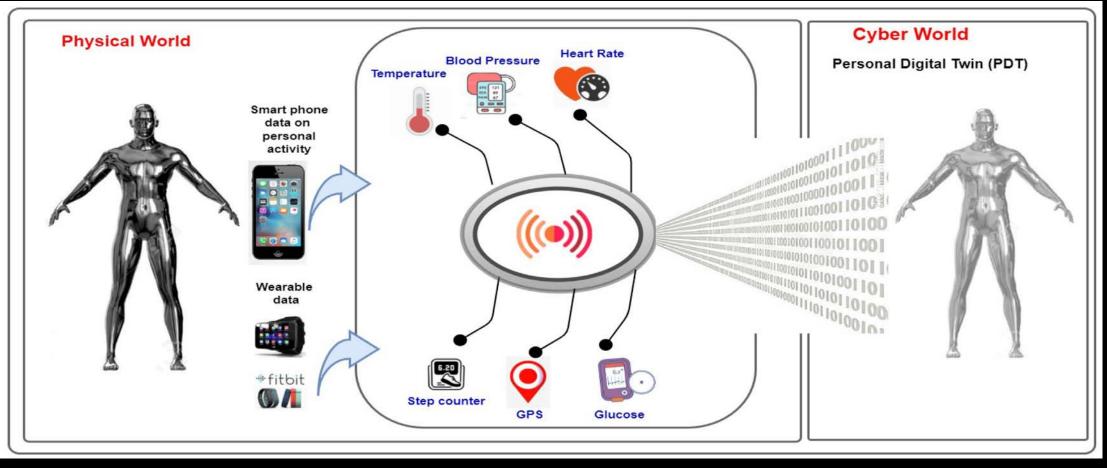
#### **RESEARCH ARTICLE**

**Open Access** 

Type 2 diabetes reversal with digital twin technology-enabled precision nutrition and staging of reversal: a retrospective cohort study

Paramesh Shamanna<sup>1</sup>, Shashank Joshi<sup>2</sup>, Lisa Shah<sup>2</sup>, Mala Dharmalingam<sup>3</sup>, Banshi Saboo<sup>4</sup>, Jahangir Mohammed<sup>2</sup>, Maluk Mohamed<sup>2</sup>, Terrence Poon<sup>2</sup>, Nathan Kleinman<sup>5\*</sup><sup>(D)</sup>, Mohamed Thajudeen<sup>2</sup> and Ashok Keshavamurthy<sup>2</sup>

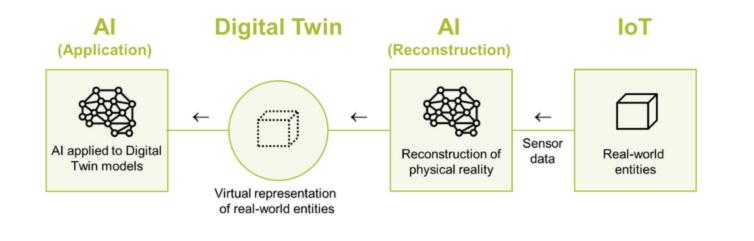
A randomized controlled trial of the tech was conducted on individuals with type-2 diabetes, to use the Whole Body Digital Twin platform (n = 199) or receive standard of care (n = 63) for 180 days.



The platform collects daily data from continuous glucose monitors (CGM), sensor watches, blood pressure meters, smart scales, detailed patient food intake information, and a mobile app to track and analyze the body's health signals in order to personalize the patient's treatment and provide daily precision nutrition guidance to the patient.

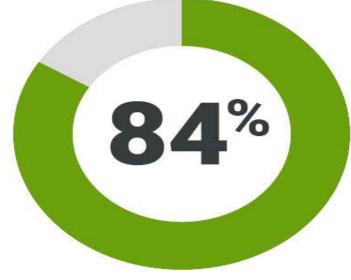


The program employs a machine learning predictive model using data from food logs and multiple sensors, including continuous glucose monitoring fitness watches and comprehensive blood tests. The technology provides individualized and timely recommendations through a mobile app to users and their care teams.



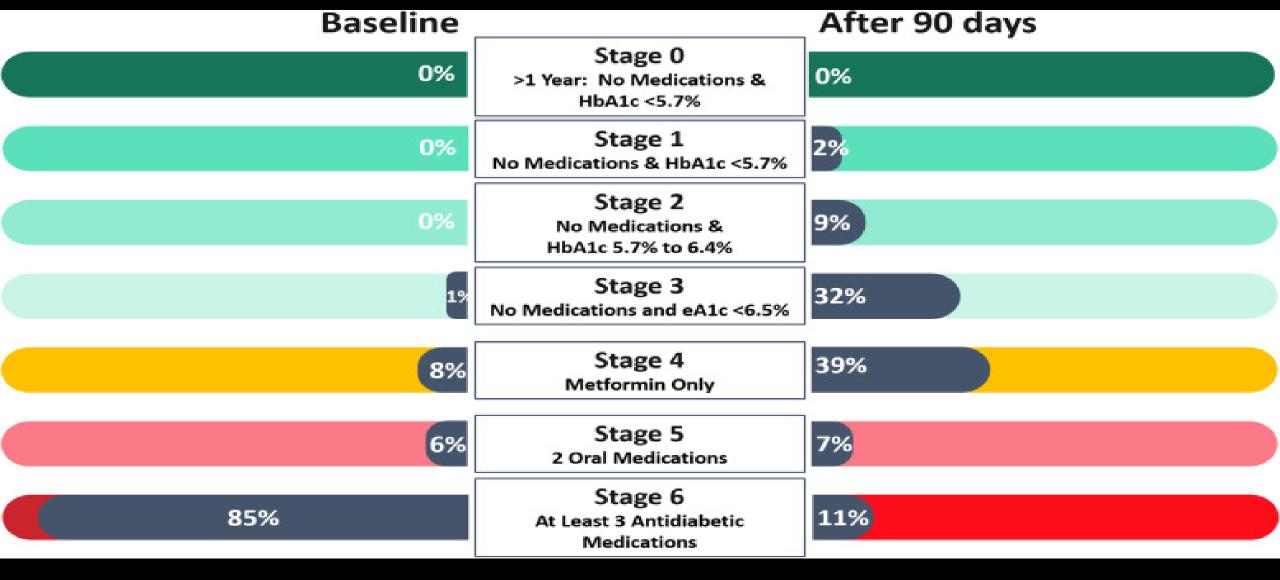
Machine learning algorithms analyzed the patient's macronutrients, micronutrients, and biota nutrients to measure and predict glucose response to specific foods. Participants were provided with specific daily food recommendations to avoid glucose spikes. Change in HbA1c from baseline to 180 days and the percentage of participants achieving type 2 diabetes remission were the primary outcomes.

Of adults with type 2 diabetes using Whole Body Digital Twin technology:



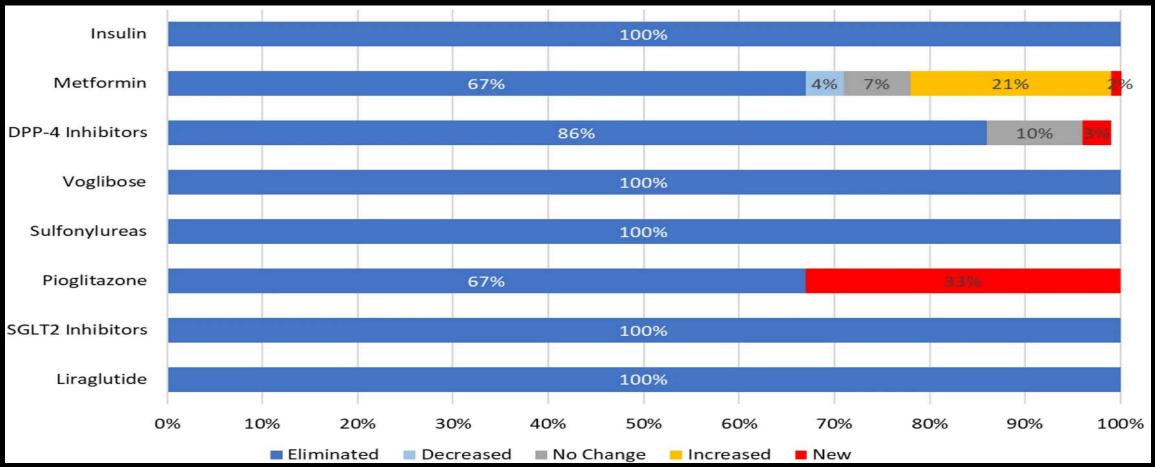
Achieved type 2 diabetes remission as defined by ADA criteria at 180 days





In interim analysis, majority of participants in the intervention group reached an HbA1c <6.5% at 180 days using no medications or metformin only

The remission was independent of the level of weight loss.



All nine participants in the intervention group who used insulin at baseline stopped using insulin prior to 90 days.



twin

### Reduce medication, lose weight, and recover from metabolic diseases

"In total, nearly 84% of the group who followed their digital twin's guidance for six months were determined to be in remission by the end of that period, per the ADA's standards—meaning they maintained normal blood glucose levels for at least three months without taking diabetes medication."

American Diabetes Association (ADA)\*

The Whole Body Digital Twin<sup>™</sup> is a digital representation of your unique metabolism and delivers precise, personalized guidance about foods, sleep, activity, and breathing through the easy-to-use app.

Twin Health's program combines the Whole Body Digital Twin<sup>™</sup> with a dedicated care team that monitors your sensor data, offers personalized recommendations, and supports you on your health journey.

\*Artificial Intelligence Offers Significant Rate of Remission for Type 2 Diabetes Compared to Standard Care. American Diabetes Association (2022, June 4).

"We were pleased to see the magnitude of remission of diabetes achieved in our study, validating the power of understanding the distinctions of each individual's unique metabolism to provide personalized recommendations," Shamanna said.

### Beating metabolic diseases is now possible with your Whole Body Digital Twin<sup>™</sup>

twin

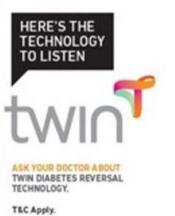
Prediabetes | Diabetes | Obesity | PCOD | Metabolic Wellness for Preventive Care

The Twin Health Program uses advanced Whole Body Digital Twin<sup>™</sup> technology to help heal your disrupted metabolism — the root cause of many chronic diseases.



Shamanna :"Our results demonstrate the potential of Whole Body Digital Twin technology to change the conventional, medication-driven management of type 2 diabetes to achieving remission of type 2 diabetes with a life free of medication in a large proportion of people. Precision lifestyle changes implemented by continued inputs delivered digitally by artificial intelligence has the potential to deliver both glycemic and extra glycemic benefits."





## REMISSION

of your chronic metabolism conditions Like Prediabetes & Obesity with Whole Body Digital Twin<sup>™</sup> twin



=

۲

Heal your metabolism to help normalize your blood sugar



Reduce costly medications including insulin



Increase energy, improve mood, and decrease symptoms



### OVERVIEW > <u>NEWS</u>

# **OPTOMICS:** Digital twin technology improving type-2 diabetes healthcare

The EU Horizon 2020 OPTOMICS project will develop and validate a digital-twin model, which aims at developing non-invasive and inexpensive prognostic and treatment planning methods for type-2 diabetes patients.



date: 18/02/2021

This so-called digital-twin model aims to improve prediction and early detection of individuals likely to develop the disease, which will improve the overall possibility for prevention. Simultaneously, the method will reveal potential risks for developing disease complications, all while personalizing patient treatment.

The project involves in-depth molecular phenotyping of individuals at the DNA, protein and metabolite level.

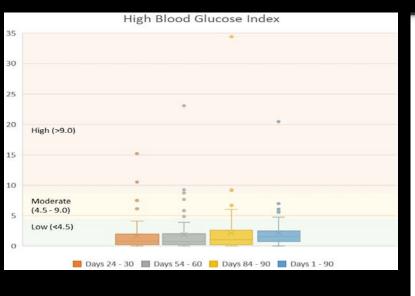
## scientific reports

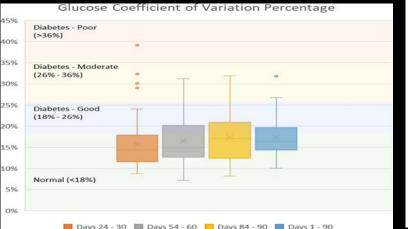
Check for updates

## OPEN Retrospective study of glycemic variability, BMI, and blood pressure in diabetes patients in the Digital Twin Precision Treatment Program

Paramesh Shamanna<sup>1</sup>, Mala Dharmalingam<sup>2</sup>, Rakesh Sahay<sup>3</sup>, Jahangir Mohammed<sup>4</sup>, Maluk Mohamed<sup>4</sup>, Terrence Poon<sup>4</sup>, Nathan Kleinman<sup>5</sup> & Mohamed Thajudeen<sup>4</sup>

The objective of this retrospective observational cohort study was to measure glycemic variability and reductions in body mass index (BMI), blood pressure (BP), and use of antihypertensive medications in type 2 diabetes (T2D) patients participating in the digital twin-enabled Twin Precision Treatment (TPT) Program. Study participants included 19 females and 45 males with T2D who chose to participate in the TPT Program and adhered to program protocols. Nine additional enrollees were excluded due to major program non-adherence. Enrollees were required to have adequate hepatic and renal function, no myocardial infarction, stroke, or angina  $\leq$  90 days before enrollment, and no history of ketoacidosis or major psychiatric disorders. The TPT program uses Digital Twin technology, machine learning algorithms, and precision nutrition to aid treatment of patients with T2D. Each study participant had  $\geq$  3 months of follow-up. Outcome measures included glucose percentage coefficient of variation (%CV), low blood glucose index (LBGI), high blood glucose index (HBGI), systolic and diastolic BP, number of antihypertensive medications, and BMI. Sixty-four patients participated in the program. Mean (± standard deviation) %CV, LBGI, and HBGI values were low (17.34±4.35, 1.37±1.37, and 2.13±2.79, respectively) throughout the 90-day program. BMI decreased from 29.23±5.83 at baseline





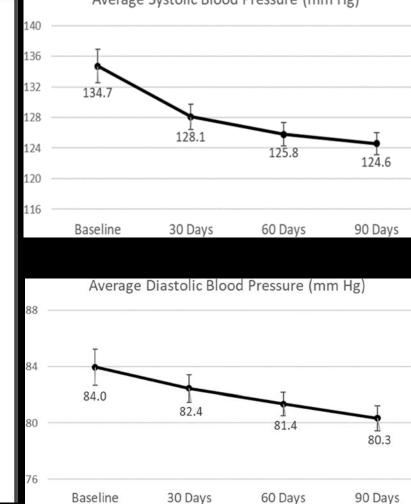
### scientific reports

### DPEN Retrospective study of glycemic variability, BMI, and blood pressure in diabetes patients in the Digital Twin Precision Treatment Program

Check for updates

Paramesh Shamanna<sup>1</sup>, Mala Dharmalingam<sup>2</sup>, Rakesh Sahay<sup>3</sup>, Jahangir Mohammed<sup>4</sup>, Maluk Mohamed<sup>4</sup>, Terrence Poon<sup>4</sup>, Nathan Kleinman<sup>553</sup> & Mohamed Thajudeen<sup>4</sup>

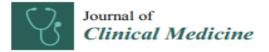
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During 90 days of the TPT Program, patients achieved low glycemic variability and significant reductions in BMI and BP.

Antihypertensive medication use was eliminated in nearly all patients.

### Average Systolic Blood Pressure (mm Hg)





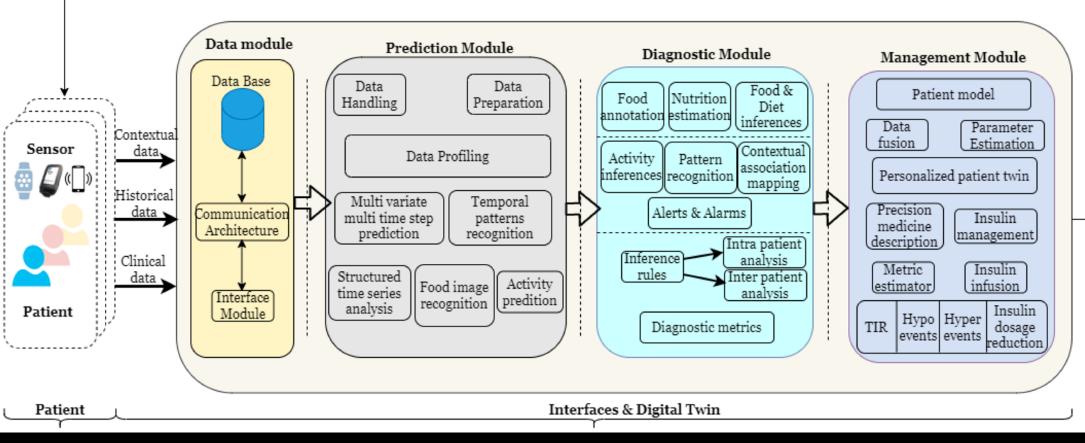
#### Article

### Human Digital Twin for Personalized Elderly Type 2 Diabetes Management

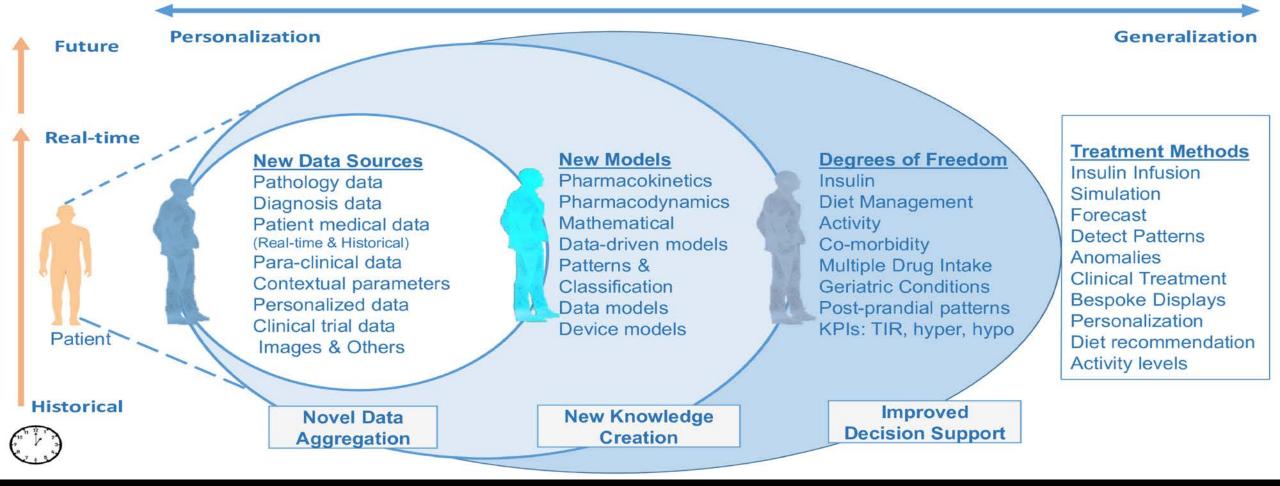
Padmapritha Thamotharan <sup>1</sup>, Seshadhri Srinivasan <sup>1,2,\*</sup>, Jothydev Kesavadev <sup>3</sup>, Gopika Krishnan <sup>3</sup>, Viswanathan Mohan <sup>4</sup>, Subathra Seshadhri <sup>1</sup>, Korkut Bekiroglu <sup>5</sup> and Chiara Toffanin <sup>6</sup>

- <sup>1</sup> Kalasalingam Academy of Research and Education, Srivilliputhur 626126, Tamil Nadu, India
- <sup>2</sup> TVS-Sensing Solutions Pvt Ltd., Madurai 625122, Tamil Nadu, India
- <sup>3</sup> Jothydev's Diabetes Research Center, Trivandrum 695032, Kerala, India
- <sup>4</sup> Madras Diabetes Research Foundation & Dr. Mohan's Diabetes Specialities Centre, Chennai 600086, Tami Nadu, India
- 5 SharkNinja, Needham, MA 02494, USA
- Departrment of Electrical, Computer and Biomedical Engineering, University of Pavia, 27100 Pavia, Italy
- Correspondence: seshadhri.s@tvsss.co.in

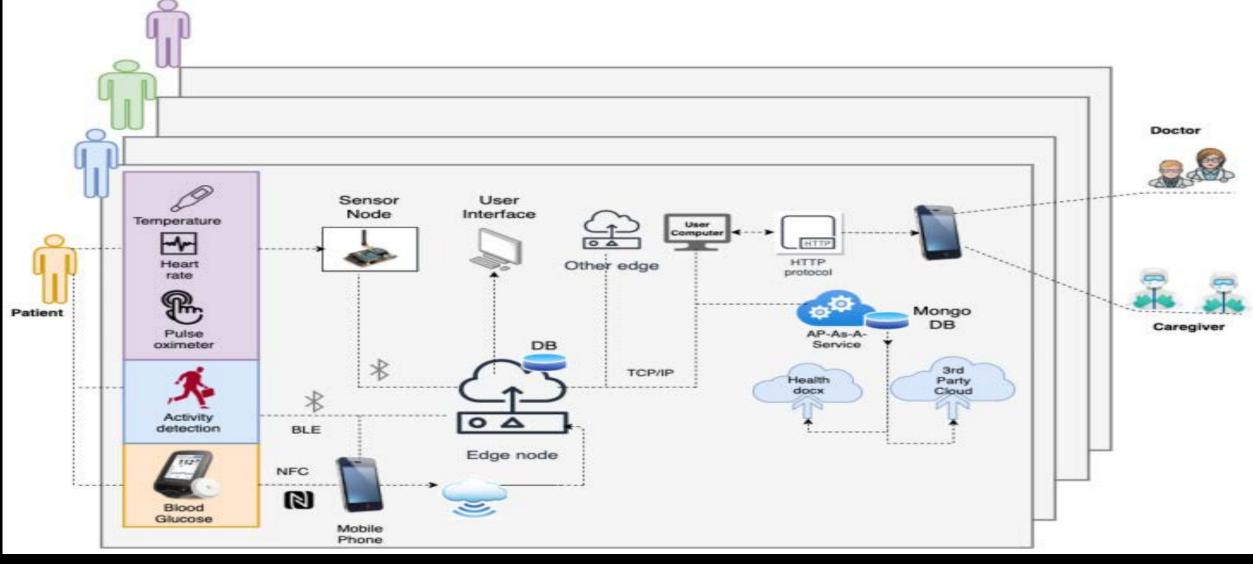
Abstract: Managing Elderly type 2 diabetes (E-T2D) is challenging due to geriatric conditions (e.g., comorbidity, multiple drug intake, etc.), and personalization becomes paramount for precision medicine. This paper presents a human digital twin (HDT) framework to manage E-T2D that exploits various patient-specific data and builds a suite of models exploiting the data for prediction and management to personalize diabetes treatment in E-T2D patients. These models include mathematical and deeplearning ones that capture different patient aspects. Consequently, the HDT virtualizes the patient from different viewpoints using an HDT that mimics the patient and has interfaces to update the virtual models simultaneously from measurements. Using these models the HDT obtains deeper



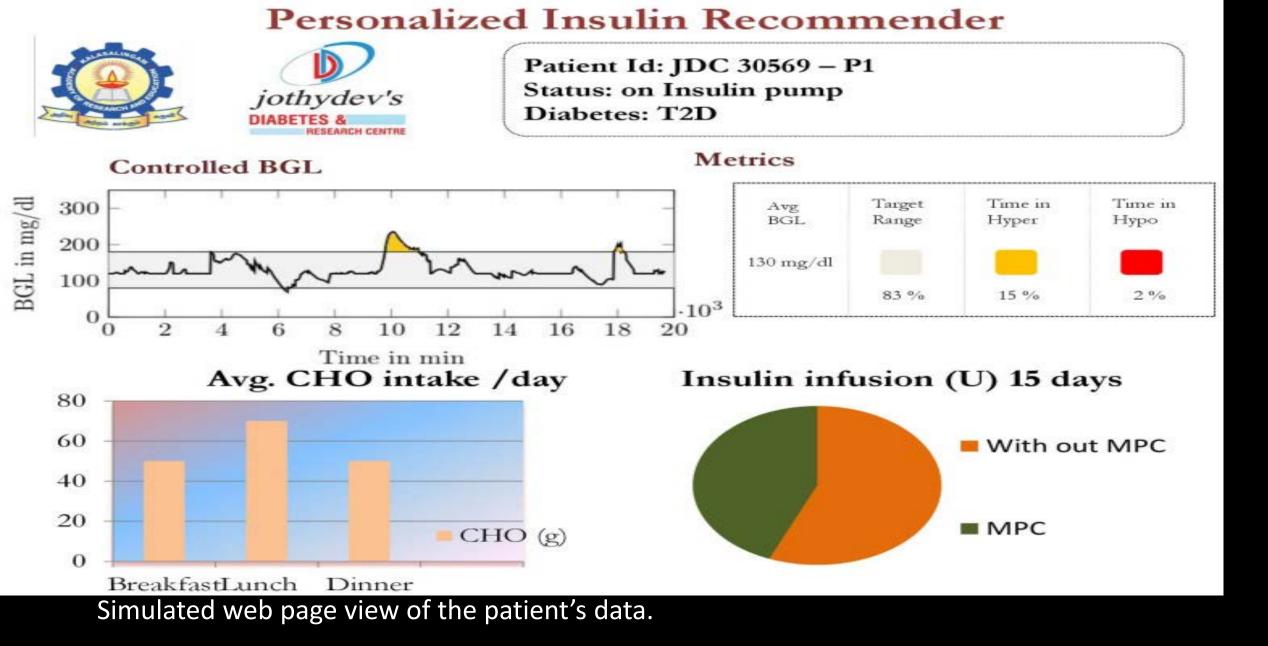
The human digital twin framework architecture

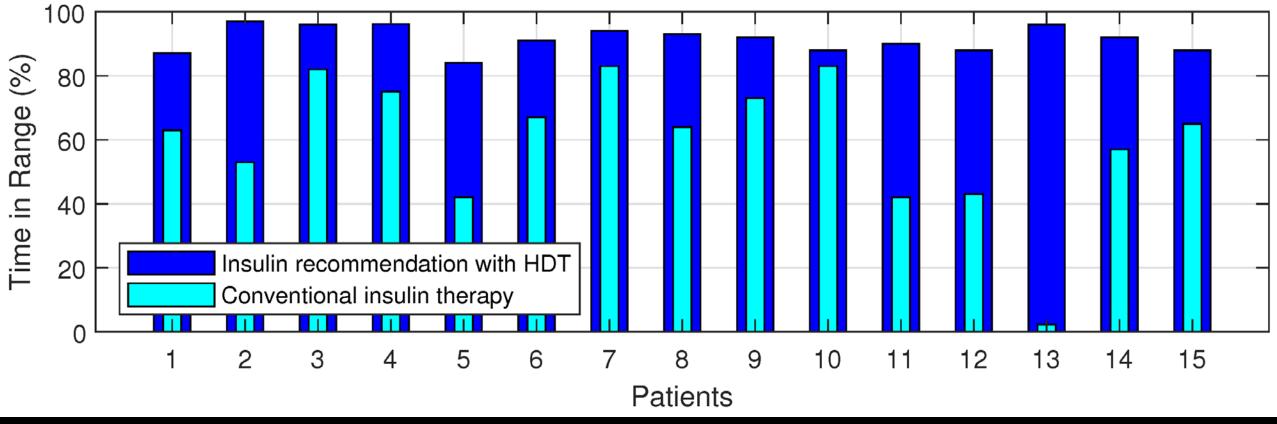


Precision Treatment Methods Through framework leads to new data, novel models that create additional knowledge, and improved decision support through new degrees of freedom.

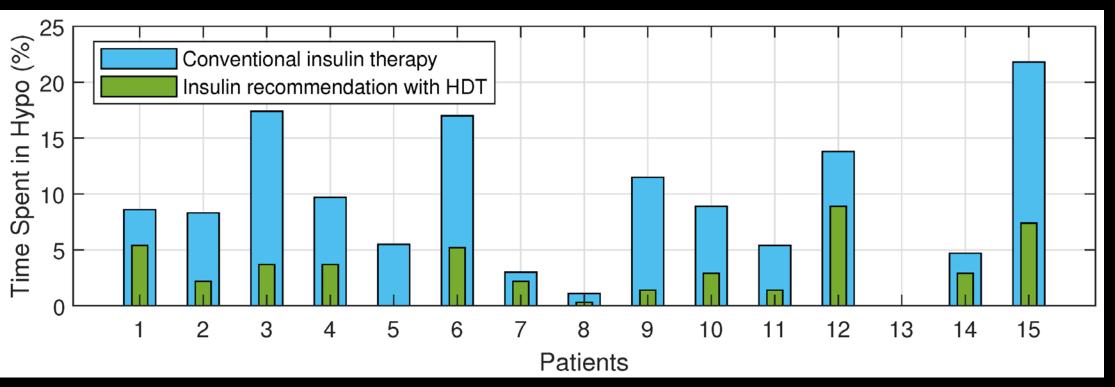


IoMT Architecture—Data transfer using IoT sensor devices from patients' (left), mounted devices to edge nodes (center) to the HDT architecture and finally to medical personnel and caretakers using a mobile app.

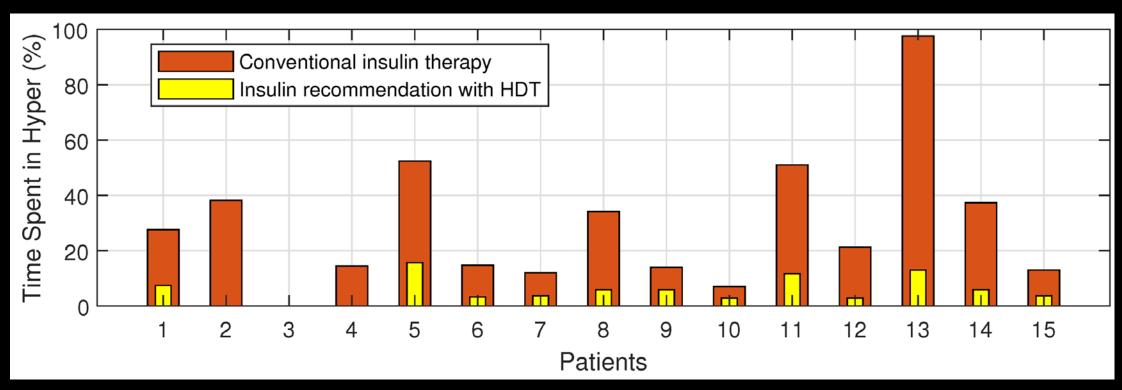




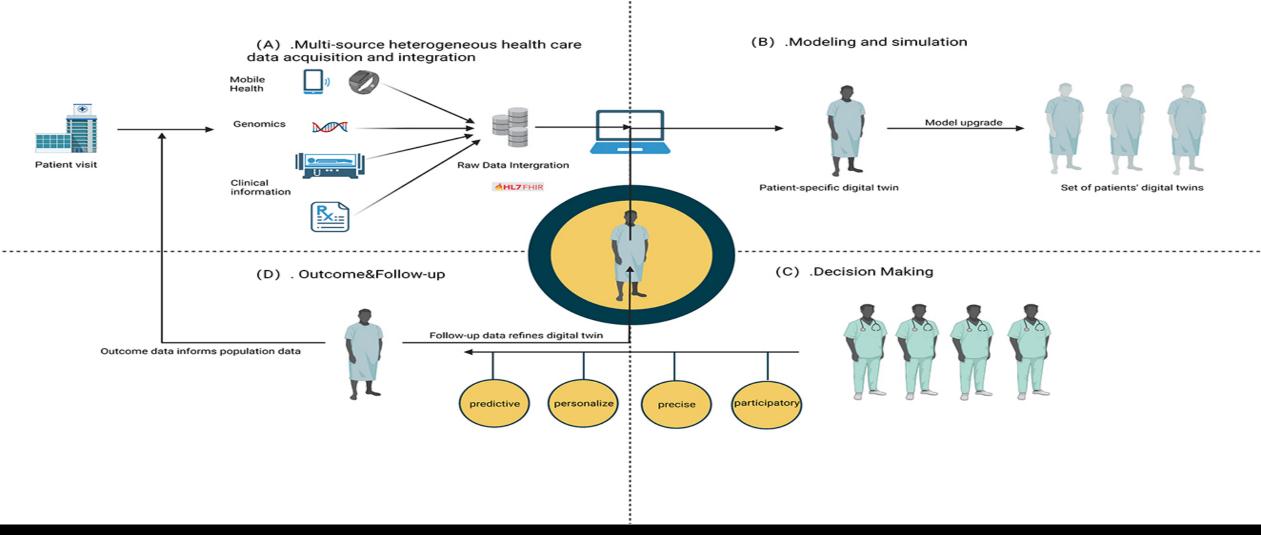
This shows that the TIR is increased from 3–75% to 86–97%.



This shows that HDT-based personalized BGL management can reduce the time spent in hypo from 0–22% to 0–9%,



This shows that HDT-based personalized BGL management can reduce percentage of time spent in hyper from 0–98 % to 0–12%.

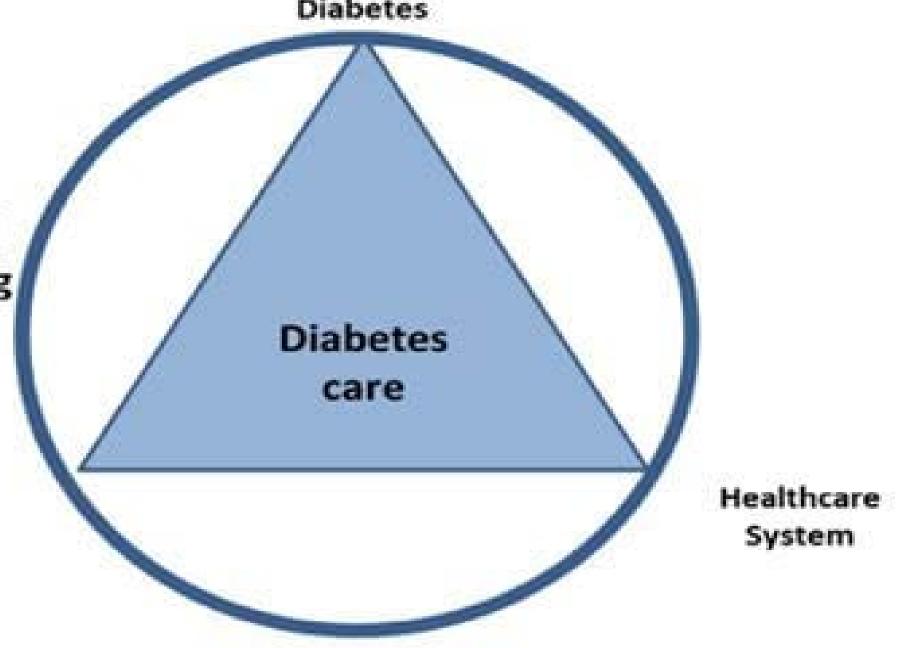


This paper presented a Human Digital Twin (HDT) framework for Elderly Type-2 Diabetes (E-T2D). The HDT enables personalization and precise insulin infusion considering.

Patients with Diabetes

## Artificial intelligence and machine learning

Healthcare Professional



Received: 10 October 2021 Revised: 13 February 2022 Accepted: 4 April 2022

DOI: 10.1002/cnm.3601

#### BASIC RESEARCH

### WILEY

Toward an artificial intelligence-assisted framework for reconstructing the digital twin of vertebra and predicting its fracture response

Hossein Ahmadian<sup>1</sup> Dukagjin M. Blakaj<sup>3</sup> William S. Marras<sup>1</sup> Prasath Mageswaran<sup>1</sup> Eric C. Bourekas<sup>4,5,6</sup> | Soheil Soghrati<sup>8,9</sup> <sup>(5)</sup>

<sup>1</sup>Department of Integrated Systems Engineering, The Ohio State University, Columbus, Ohio, USA

<sup>2</sup>Department of Biomedical Engineering, The Ohio State University, Columbus, Ohio, USA

<sup>3</sup>Department of Radiation Oncology, The Ohio State University, Columbus, Ohio, USA

<sup>4</sup>Department of Neurological Surgery, The Ohio State University, Columbus, Ohio, USA

<sup>5</sup>Department of Radiology, The Ohio State University, Columbus, Ohio, USA

<sup>6</sup>Department of Neurology, The Ohio State University, Columbus, Ohio, USA <sup>7</sup>Department of Orthopedics, The Ohio State University, Columbus, Ohio, USA <sup>8</sup>Department of Mechanical and

Aerospace Engineering, The Ohio State University, Columbus, Ohio, USA

<sup>9</sup>Department of Materials Science and Engineering The Ohio State University

#### Abstract

This article presents an effort toward building an artificial intelligence (AI) assisted framework, coined ReconGAN, for creating a realistic digital twin of the human vertebra and predicting the risk of vertebral fracture (VF). ReconGAN consists of a deep convolutional generative adversarial network (DCGAN), image-processing steps, and finite element (FE) based shape optimization to reconstruct the vertebra model. This DCGAN model is trained using a set of quantitative micro-computed tomography (micro-QCT) images of the trabecular bone obtained from cadaveric samples. The quality of synthetic trabecular models generated using DCGAN are verified by comparing a set of its statistical microstructural descriptors with those of the imaging data. The synthesized trabecular microstructure is then infused into the vertebra cortical shell extracted from the patient's diagnostic CT scans using an FE-based shape optimization approach to achieve a smooth transition between trabecular to cortical regions. The final geometrical model of the vertebra is converted into a high-fidelity FE model to simulate the VF response using a continuum damage model under compression and flexion loading conditions. A feasibility study is presented to demonstrate the applicability of digital twins

Benjamin A. Walter<sup>2</sup>

Ehud Mendel<sup>3,4,7</sup>



## 

## Endless Electric Motion

#### Medical & healthcare

### AI-assisted digital twin could predict spinal column fractures in cancer patients

News | ③ 2 min read

An Al-assisted digital twin of human vertebrae could predict how cancer affects the probability of spinal column fractures, a study from Ohio State University has found.



06 May 2022

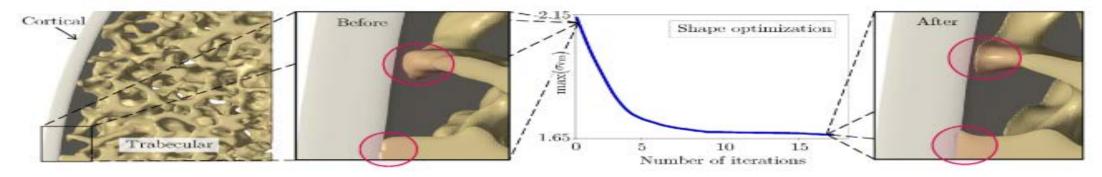


FIGURE 8 Performing finite element-based shape optimization to obtain a tapered transition from cortical to trabecular bone in the virtual vertebra model, which avoid unrealistic stress concentrations in these regions during Vertebral Compression Fracture (VCF) simulations

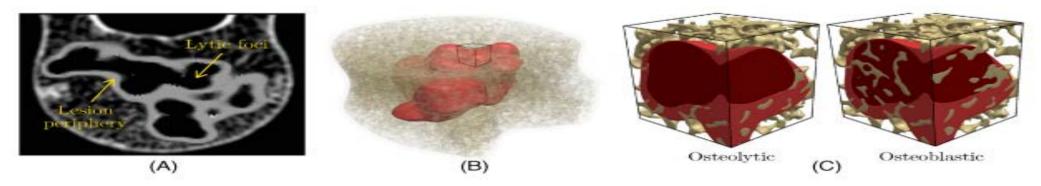


FIGURE 9 (A) Co-registered CT-MRI scan of a vertebra with a metastatic tumor; (B) 3D reconstruction of tumor morphology added to the virtual vertebral model generated using ReconGAN; (C) comparing lytic and blastic tumors in a small portion of the trabecular bone

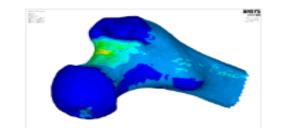
## An AI-assisted framework, coined ReconGAN, was developed for synthesizing realistic digital twins of the human vertebra and predicting its fracture response.

ReconGAN enables integrating diagnostic imaging data (e.g., CT scans) with virtual microstructural models of the trabecular bone, to create realistic geometrical models of the whole vertebra.



### Comp8ioMed

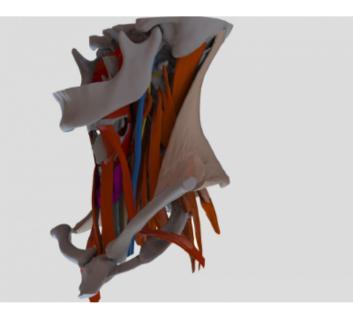
- To develop an efficient digital twin solution for the estimation of long bone fracture risk in elderly patients (CT2S solution)
- To not only be able to evaluate the bone strength at present, but also predict the changes in the next 10 years (ARF10 solution)
- To extend the digital twin solution to predict other types of fracture, such as the vertebral
- To enable the running of large scale in silico clinical trials (BoneStrength solution, with a current target for bone treatments)
- To port these solutions on multiple HPC platforms across Europe and solve potential scalability issues





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Rector's message
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Administration
Normative documents
University history
Journals
5-100 Program
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LETI corporate identity
Contacts
Open Door Day
Academic Competition "Gazprom" for school students

LETI Scientists Developed a Digital Twin of a Neck for Effective Thyroid Surgery Planning



The model will also allow studying the effect of surgical intervention on the biomechanics of the patient's neck.

10.10.2022 @ 290

### DeepLife deeplife.co

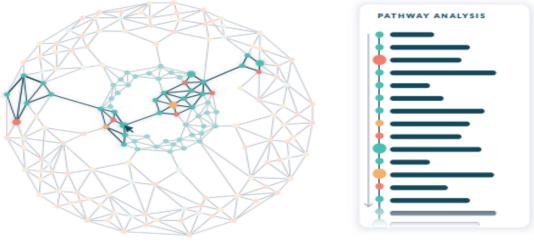
## ೨ DeepLife.

# How digital twins of human cells are accelerating drug discovery

Designed to reshape drug discovery and drug repositioning, systems biology company DeepLife has created a datadriven technology platform that creates digital twins of human cells, to evaluate response to new drug candidates.

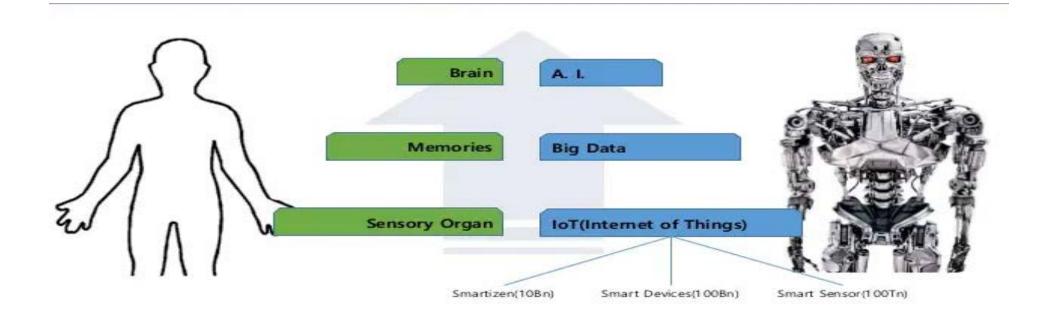
The rapid proliferation of omics data, which provides essential information regarding biomolecular activity within cells, is transforming drug discovery. Equipped with this data, DeepLife, a next generation systems biology company, has established a platform for creating digital twins of human cells, enabling scientists to rapidly evaluate how unhealthy cells respond to drug candidates in silico. DeepLife has deployed and established proof-of-concept for its platform, and is now actively seeking partners for target identification and drug repositioning projects enabled by its digital twin technology.

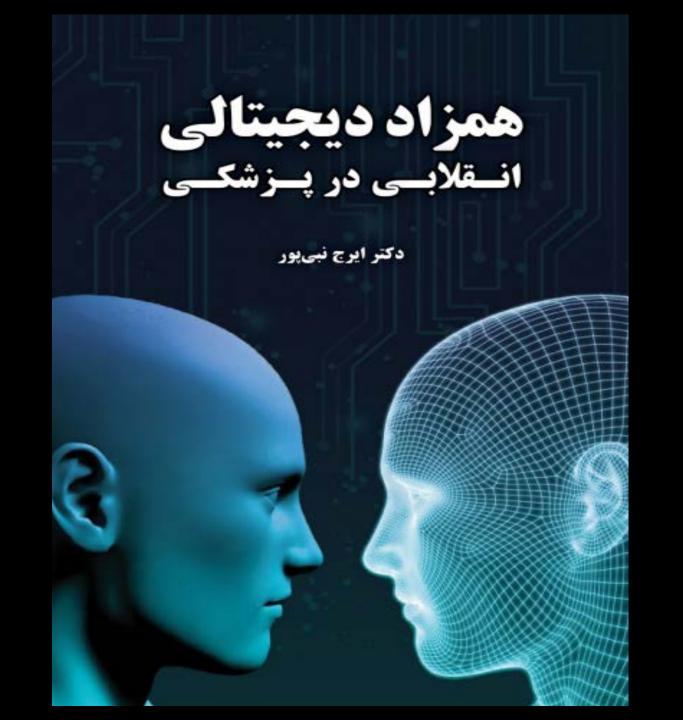
All diseases, and efforts to treat them, start at the cellular level. Small changes in the trillions of chemical interactions that make up human cells, which can be triggered by mutations or external forces, can cause cells to enter pathological states that ultimately manifest in diseases. The massive scale and complexity of the inner workings of cells has traditionally impeded efforts to identify the drivers of diseases through the iterative reconstruction of cell mechanisms, but science is now taming the challenge.





DeepLife has mapped more than 30 atlases with more than 20 million single. The atlases span brain, blood, liver, lung, intestines, and other tissues and organs, and DeepLife updates them monthly using more than 20 qualified data repositories.





# www. https://futuremedical.ir/

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یکشنبه, ۹۰ مهر ۱۴۰۲



کارگروه جنوب فرهنگستان علوم پزشکی جمهوری اسلامی ایران



خانه درباره اندیشکده کتابخانه مرزهای دانش بستههای سیاستی پژوهشها رویدادها پیوندها تماس

9



## كتابخانه

در این صفحه شما میتوانید به کتابهایی با موضوع آیندهپژوهشی و یا آیندهنگاری پزشکی دسترسی داشته باشید.



علوم پایه برای توسعه پایدار

نویسنده: ایرج نبیپور



## همزاد دیجیتالی: انقلابی در پزشکی

نویسندہ: ایرج نبیپور



### آینده پزشکی ایران

بر پایه یک مدل سناریونویسی نویسندگان: دکتر معصومه جرجانی، دکتر مجید اسدی، دکتر سید حسن مقدم نیا، دکتر مجید فصیحی هرندی، دکتر ایرج نبیپور



### علوم غدد آینده و فناوریهای همگرا

نویسندہ: ایرج نبیپور



زيستشناسي كوانتومي

المتعادية والمتعادية والمتعادين المتعادية الشار



# فناوریهای همگرا و آینده داروسازی

