

The WCM Institute of Al for Digital Health (AIDH)

Annual Report - 2024

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Mission



Our mission is to advance **individualized health** and healthcare with **data-driven** insights derived from applying **artificial intelligence** technologies. The institute will establish a community of experts across multiple disciplines in **computational science** and **clinical medicine**, facilitate collaborations, promote **multi-disciplinary research**, and engage in **entrepreneurship** and technology **commercialization**.



Team

Team

Faculty







Research Scientists



















Graduate Students











Admin



Faculty Affiliates



Activities

Seminar Series



1x month



20 seminars



50+ participants per seminar



15 institutions represented



Gather Together







Invited Presentations





Fei Wang

April 7, 11am-12pm EDT

Al for Digital Health: A Full-Stack Health Data Science Perspective



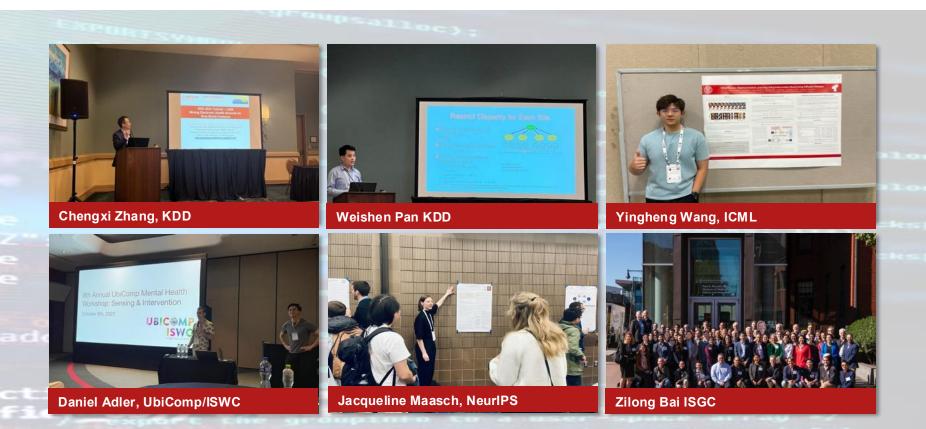








Conference Attendance



Press





How can chatbots be used in medicine?







(ii) Weill Cornell Medicine

MoFlow: An Invertible Flow

Model for Generating

Molecular Graphs



Dr. Fei Wang Provides Insight on the Use of **Artificial Intelligence in Healthcare Diagnostics**

August 22, 2023







News For Medical Professionals

Infectious Disease

May 9, 2023

y f in

Blood Tests for Long COVID Could Lead to **Better Treatments**



With Pathology at Vanguard, Al Infiltrates

Healthcare Diagnostics Space

Jul 25, 2023 | Greg Cima

360[®]



The Atlantic

Doctors Still Struggle to Diagnose a Condition That Kills More Americans Than Stroke

Can computers crack the code of sepsis?

Research

Publications

52

Papers

5100+ Citations

2100+

Tweets

190+

News Outlets



JAMA Pediatrics









nature medicine 6

Data-driven identification of post-acute SARS-CoV-2 infection subphenotypes

Received: 8 June 2022
Accepted: 2 November 2022
Published online: 1 December 2022

Check for updates

Hao Zhang [©], Chengxi Zangʻ, Zhenxing Xuʻ, Yongkang Zhangʻ, Jia Xuʻ, Jiang Bilan [©], Omltry Morczykʻ, Dhruv Khullari, Yiye Zhangʻ, Anna S. Nordvigʻ, Edward J. Schenck [©], Elizabeth A. Shenkman [©], Russell L. Rothman^{*}, Jason P. Block^{*}, Kristin Lyman^{*}, Mark C. Weiner [©], Thomas W. Carton^{*}, Fell Wang [©] ".- & Rainix Kaushal [©]

The post-acute sequelae of SARS-CoV-2 infection (PASC) refers to a broad spectrum of symptoms and signs that are persistent, exacerbated or newly incident in the period after acute SARS-CoV-2 infection. Most studies have examined these conditions individually without providing evidence on co-occurring conditions. In this study, we leveraged the electronic health record data of two large cohorts, INSIGHT and OneFlorida+, from the national Patient-Centered Clinical Research Network. We created a development cohort from INSIGHT and a validation cohort from OneFlorida+including 20.881 and 13.724 patients, respectively, who were SARS-CoV-2 infected, and we investigated their newly incident diagnoses. 30-180 days after a documented SARS-CoV-2 infection. Through machine learning analysis of over 137 symptoms and conditions, we identified four reproducible PASC subphenotypes, dominated by cardiac and renal (including 33.75% and 25.43% of the patients in the development and validation cohorts); respiratory, sleep and anxiety (32.75% and 38.48%); musculoskeletal and nervous system (23, 37% and 23, 35%); and digestive and respiratory system (10.14% and 12.74%) sequelae. These subphenotypes were associated with distinct patient demographics, underlying conditions before SARS-CoV-2 infection and acute infection phase severity. Our study provides insights into the heterogeneity of PASC and may inform stratified decision-making in the management of PASC conditions.

nature communications

sticle

https://doi.org/10.1038/s41467-023-43929-1

High-throughput target trial emulation for Alzheimer's disease drug repurposing with real-world data

Received: 13 February 2022 Accepted: 24 November 2023 Published online: 11 December 2023 Chengxi Zang $^{0.2}$, Hao Zhang $^{0.1}$, Jie Xu³, Hansi Zhang³, Sajjad Fouladvand⁴, Shreyas Havaldar⁵, Feixiong Cheng $^{0.7.8}$, Kun Chen $^{0.9}$, Yong Chen 10 , Benjamin S. Glicksberg $^{0.5}$, Jin Chen⁴, Jiang Bian $^{0.3}$ & Fei Wang $^{0.12}$ $\stackrel{1}{\cong}$

Check for updates

Target trial emulation is the process of minicking target randomized trial using real-world data, where effective confounding control for unbiased treatment effect estimation remains a main challenge. Although various is approaches have been proposed for this challenge, a systematic evaluation is approaches have been proposed for this challenge, a systematic evaluation is all lacking, Here we emulated trials for thousands of medications from two large-scale real-world data warehouses, covering over 10 years of clinical records for over 170 million patients, aming to identify new indications of approved drugs for Alzheimer's disease. We assessed different propensity sore modes under the inverse probability of treatment weighting framework and suggested a model selection strategy for improved baseline covariate abancing. We also found that the deep learning based propensity score model did not necessarily outperform logistic regression based methods in covariate balancing. Finally, we highlighted the top-ranked drugs (pantoprazole, gabapentin, acrovastatin, fluticasone, and omeprazole) originally intended for other indications with potential beenfils for Alzheimer's patients.

nature communications

Article

https://doi.org/10.1038/s41467-023-37653-z

Data-driven analysis to understand long COVID using electronic health records from the RECOVER initiative

Received: 8 June 2022

R Check for updates

Accepted: 24 March 2023 Published online: 07 April 2023 Chengel Zang¹, Yongkang Zhang¹, Jie Xu², Jiang Bian Θ^2 , Dmitry Morczysk¹, Edward J. Schenck Φ^3 , Dhruv Khullar¹, Anna S. Nordvig¹, Bizabeth A. Shenkenan Φ^2 , Russell L. Rothman Φ^3 , Jason P. Block⁶, Kristin Lyman⁷, Mark G. Weiner Φ^1 , Thomas W. Carton⁷, Fel Wang $\Phi^1 \subseteq \Delta$ Rainu Kaushal P.

Recent studies have investigated post-acute sequelae of SARS-CoV-2 infection (PASC, or long COVID) using real-world patient data such as electronic health records (EHR). Prior studies have typically been conducted on patient cohorts with specific patient populations which makes their generalizability unclear. This study aims to characterize PASC using the EHR data warehouses from two large Patient-Centered Clinical Research Networks (PCORnet), INSIGHT and OneFlorida+, which include 11 million patients in New York City (NYC) area and 16.8 million patients in Florida respectively, With a high-throughput screening pipeline based on propensity score and inverse probability of treatment weighting, we identified a broad list of diagnoses and medications which exhibited significantly higher incidence risk for patients 30-180 days after the laboratory-confirmed SARS-CoV-2 infection compared to non-infected patients. We identified more PASC diagnoses in NYC than in Florida regarding our screening criteria, and conditions including dementia, hair loss, pressure ulcers, pulmonary fibrosis, dyspnea, pulmonary embolism, chest pain, abnormal heartbeat, malaise, and fatigue, were replicated across both cohorts. Our analyses highlight potentially heterogeneous risks of PASC in different

Research

JAMA Pediatrics | Original Investigation

Patterns of Social Determinants of Health and Child Mental Health, Cognition, and Physical Health

Yurnyu Xiao, Phū): John Mann, MD; Julian Chun-Chung Chow, Phū; Timothy T, Brown, Phū; Jonishe R, Snowden, Phū; Paul Siu-Fai Yip, Phū; Alexander C, Tsai, MD, Phū; Yu Hou, Phū; Jonishman Pathak, Phū; Fei Wang, Phū; Chang Su, Phū

IMPORTANCE Social determinants of health (SDOH) influence child health. However, most previous studies have used individual, small-set, or cherry-picked SDOH variables without examining unbiased computed SDOH patterns from high-dimensional SDOH factors to investigate associations with child mental health, cognition, and physical health.

OBJECTIVE To identify SDOH patterns and estimate their associations with children's mental, cognitive, and physical developmental outcomes.

DESIGN, SETTING, AND PARTICIPANTS This population-based cohort study included children aged 9 to 10 years at baseline and their caregivers enrolled in the Adolescent Brain Cognitive Development (ABCD) Study between 2016 and 2021. The ABCD Study includes 21 sites across 17 states.

EXPOSURES Eighty-four neighborhood-level, geocoded variables spanning 7 domains of SDOH, including bias, education, physical and health infrastructure, natural environment, socioeconomic status, social context, and crime and drugs, were studied. Hierarchical aeglomerative clustering was used to identify SDOH patterns.

Funding

Involved Projects Totaling 57M, AIDH Portion Total: 9.75M



































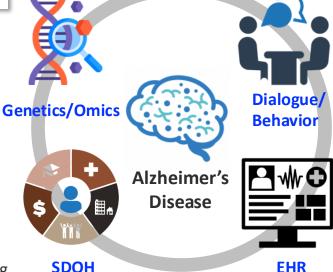
Project Highlights



AD-linked R47H-TREM2 mutation induces disease-enhancing microglial states via AKT hyperactivation



R01AG080624 PI: Jiang Bian, Yi Guo, Fei Wang 2023-2028 RF1AG084178 PI: Hui Hu, Jiang Bian, **Fei Wang** 2023-2028 R01AG076448 PI: Feixiong Cheng, Fei Wang, Li Gan 2022-2027



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Article | Open Access | Published: 31 March 2020

Scalable diagnostic screening of mild cognitive impairment using Al dialogue agent

Fengyi Tang, [kechukwu Uchendu, Fei Wang, Hiroko H. Dodge & Jiayu Zhou Scientific Reports 10, Article number: 5732 (2020) | Cite this article

3362 Accesses | 6 Citations | 30 Altmetric | Metrics

RF1AG072449 PI: Jiayu Zhou, Fei Wang, Hitoko Dodge 2021-2024



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Article Open access Published: 11 December 2023

High-throughput target trial emulation for Alzheimer's disease drug repurposing with real-world data

Chengxi Zang, Hao Zhang, Jie Xu, Hansi Zhang, Sajjad Fouladvand, Shreyas Havaldar, Feixiong Cheng, Kun Chen, Yong Chen, Benjamin S. Glicksberg, Jin Chen, Jiang Bian & Fei Wang [⊠]

Nature Communications 14, Article number: 8180 (2023) Cite this article

R01AG076234 PI: Fei Wang, Bian Jiang 2022-2027 R01AG080991 PI: Fei Wang, Bian Jiang 2023-2028

Large Initiative Participation: RECOVER PCORnet Adult EHR Study



The National Institutes of Health (NIH) created the RECOVER Initiative to learn about the long-term effects of COVID.

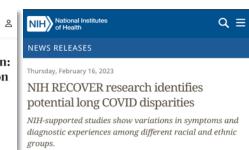
The goal of RECOVER is to rapidly improve our understanding of and ability to predict, treat, and prevent PASC (post-acute sequelae of SARS-CoV-2), including Long COVID.

PI: Dr. Rainu Kaushal
Our role: Lead the efforts on machine
learning for deriving insights of long
COVID from large scale EHRs









https://recovercovid.org/

Large Initiative Participation: The NYP Cardiology Al Initiative

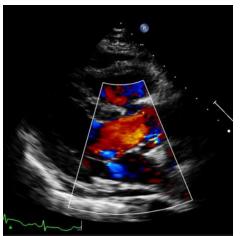
\$15M Collaboration Aims to Advance Cardiovascular Care with Analytics, Al

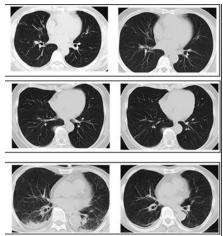
NewYork-Presbyterian will contribute \$15 million in funding to support a new initiative aimed at predicting and preventing heart failure and improving cardiovascular health interventions overall.



https://healthitanalytics.com/news/15m-collaboration-aims-to-advance-cardiovascular-care-with-analytics-ai

PI: Dr. Deborah Estrin & Kavita Bala NYP Contact: Ashley Beecy Our role: Co-lead the efforts of machine learning for predicting heart function from echocardiograms and chest CTs





Education/Training



AI in Medicine II

This class will teach students more advanced topics on Al in medicine. It requires students to have taken the Al in medicine I class. The contents of the class cover generalizability of Al models, computational fairness, model interpretation and explanation, privacy and security, federated learning, multi-modal learning, generative Al, causal inference, target trial emulation. The students will be asked to do a final project with teams based on the contents taught in the class, and python programming will be needed for doing the project.



Machine Learning for Health

This course introduces students the various types of health data, including patient clinical records, medical images, physiological and vital signals from wearable sensors, multi-omics, etc. and how to use machine learning algorithms to analyze these data and help with real world health problems such as patient screening, risk modeling, disease subtyping and precision medicine. The technical topics to be introduced in this class include classic supervised and unsupervised learning, network analysis, probabilistic modeling, deep learning, transfer learning, algorithmic fairness and interpretability. We will also invite clinicians or researchers working in the health industry to deliver guest lecturers in the class. The students will gain hands-on experience on analyzing real world health data during course assignments and projects.



Al for Healthcare System Engineering

The purpose of this class is to teach students the fundamentals of artificial intelligence (AI) technologies and how they can be applied in various healthcare system engineering problems. We will start introducing students the basic concepts of artificial intelligence (AI) and its history, as well as the various types of healthcare data and their representations. We will then introduce conventional AI technologies including supervised learning for tasks like clinical risk prediction and computer assisted diagnosis, unsupervised learning methods for subtype identification and pattern discovery. Next we will introduce deep learning methods, including the basic perceptron and feedforward neural networks for standard vectorized data, convolutional neural networks for analyzing medical images, recurrent neural networks and transformer for analyzing event sequences and temporal signals, and graph neural networks for analyzing networks and relational data. The class includes both lectures introducing algorithms and theories, and programming exercises to get hands-on experience on implementing these algorithms with Python. After the class the students will be able to understand the basic concept of AI and solve the real world healthcare system engineering problems with the learned knowledge.

Alumni & Faculty Mentorship



Postdoc Fellows





Tech Transfer

TrialGenie: A Multi-Agent System for Intelligent Clinical Trial Design



Fei Wang, Ph.D.Professor of Population Health Sciences, Weill Comell Medical College

Technology Overview

- The Technology: A multiagent system which allows insights to be extracted from real world data to perform target trial emulation
- Distinct computational nodes—a "Supervisor," "Trialist,"
 "Clinician," "Informatician," and "Statistician"—handle
 specialized tasks such as extracting clinical trial information or
 mapping trial information to electronic health records
- The platform's modular, agent-based design ensures consistent interplay between clinical domain expertise and analytics rigor
- PoC Data: The platform was used to emulate a historical trial evaluating the effectiveness of corticosteroids in managing sepsis within the ICU, identifying an average treatment effect and hazard ratio consistent with effects from the actual randomized controlled trial
- Applications: Post-market studies assessing real-world effectiveness, identification of label expansion opportunities, clinical trial design and planning, adaptive clinical trial design, strategic decision making and portfolio prioritization

Patents

Patents: Provisional Application Filed

MIMIC-IV

Supporting Data / Figures Hi Trialist, get the trial NCT03872011 to emulate Hi Informatician, prepare and clean the dataset based on the provid target trial information. Parsed trial information is as follows: within 12 hours' Exclusion Criteria: 'Systemic corticosteroid therapy within the last : months before septic shock', 'Immunosuppression', 'Pregnant', 'Known glucose-6 phosphate dehydrogenase (G-6PD) deficiency. 'Known glucose-6 phosphate dehydrogenase (G-6PD) deficiency' 'Known allergy to vitamin C, hydrocortisone, or thiamine', 'Known allergy to vitamin C, hydrocortisone, or thiamine', 'Known allergy to vitamin C, hydrocortisone, or thiamine' Treatment Definition: Hydrocortisone at a dose of 160 mg within 24 hours after the ICU admission Outcome Definition: 28-day mortality Hi Informatician, the covariates should include: gender, age, lactate, ph, so2, po2, pco2, aado2, aado2, calc, pao2fio2ratio, baseexcess bicarbonate, totalco2, hematocrit, hemoglobin, temperature, chloride Informatician calcium, glucose, potassium, sodium, gcs, platelets, wbc, albumin, globulin, total_protein, aniongap, bun, creatinine, d_dimer, fibrinoger inr, pt, ptt, heart_rate, abp, dbp, mbp, resp_rate, urineoutput, sofa Hi Statistician, here is the analysis-ready dataframe.

Figure 1: Left: Overview of agent interactions within the emulation framework **Right:** Flowchart illustrating the communication process and task delegation among the agents in the multi-agent system for clinical trial emulation.

Hi Clinician, please review the trial emulation results and provide insights or recommendations on the clinical implications of the

findings. Covariate balance was achieved except for globulin.

Hi Informatician, drop the covariate globulin and regenerate the

Non-Invasive Device for Voice Restoration After Laryngectomy



Anaïs Rameau, M.D.
Assistant Professor of Otolaryngology, Weill Cornell Medical College

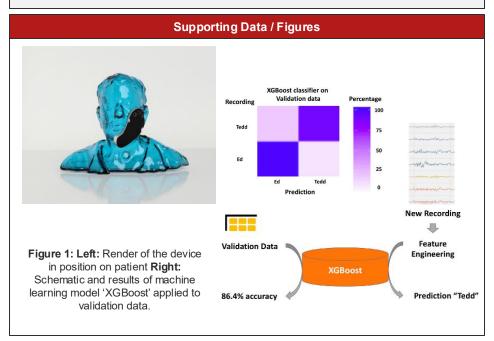
Technology Overview

- The Technology: A novel, personalized device for voice restoration using machine learning applied to surface EMG (sEMG) signal
- The inventors have created a tailored device to conform to a patient's unique anatomy with sensors on the articulatory muscles of the face and neck
- The device detects the sEMG signals and applies a predictive machine-learning model to translate silent speech into words
- PoC Data: The inventors collected data using this device from a laryngectomy patient silently articulating 'Tedd' and 'Ed'
- The team trained a predictive model for automatic speech recognition of these words, which had an 86.4% word recognition accuracy
- Applications:
 - Voice restoration for laryngectomy patients
 - Silent speech recognition for noisy or difficult environments

Patents & Publications

Patents: US Application Filed

Publication: Rameau. Head Neck. 2020.



Footnotes

Integrated AI Platform for Early Preeclampsia Detection and Risk Assessment



Zhen Zhao, Ph.D.
Professor of Clinical Pathology and Laboratory Medicine,
Weill Comell Medical College

Technology Overview

- The Technology: An Al-driven system for early prediction of preeclampsia risk that integrates routine clinical data with machine learning algorithms.
- The platform integrates diverse clinical inputs (including standard laboratory tests, maternal characteristics, and optional specialized biomarkers) to enable risk assessment across all healthcare settings, from hospitals to resource-limited environments.
- The system incorporates point-of-care testing capabilities and provides automated, user-friendly results without requiring specialized expertise
- Applications: The platform enables routine screening for early risk assessment and intervention, while supporting remote patient monitoring through telehealth integration
- Its flexibility allows deployment across various healthcare settings, from sophisticated hospital systems to resource-limited environments, making standardized preeclampsia risk assessment more widely accessible

Patents & Publications Patents: Provisional Filed

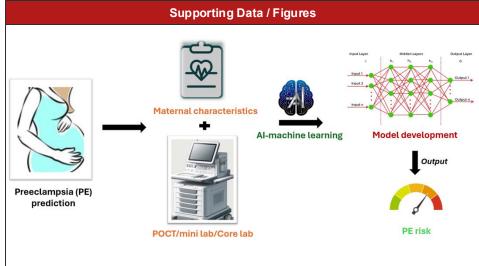


Figure 1: Overview of Al-driven preeclampsia prediction system workflow. The platform combines maternal characteristics with laboratory data from various testing options (POCT/mini lab/core lab) to generate a preeclampsia risk assessment through machine learning algorithms.

NerveAl: An ML-enabled Platform for Identification of Nerve Pain



Lisa Gfrerer, M.D.Assistant Professor of Surgery (Plastic Surgery), Surgery, Weill Comell Medical College

Technology Overview

- The Technology: Platform for screening patients for nerve pain using a digital 3D model of the head on which patients draw their pain
- The platform leverages Al-based pattern recognition to automatically evaluate pain drawings to diagnose nerve pain and identify patients that are candidates for headache surgery
- A prototype of the platform has been developed and trained on 1,300 3D pain drawings
- PoC Data: The highest performing model, a multilayer perceptron (MLP) model, distinguished nerve pain from other types of head and neck pain with an AUROC of 0.879, precision of 0.943, specificity of 0.611, and sensitivity of 0.640
- Another model, XGBoost, performed exceptionally well in detecting different types of nerve pain such Trigeminal Neuralgia (AUROC: 0.954), occipital nerve pain (AUROC: 0.928), and frontal nerve pain (AUROC: 0.930)

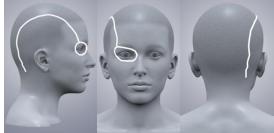
Patents & Publications

Patents: Provisional Filed

Publications: Chartier et al. Plast Reconstr Surg. 2023. Gfrerer et al. Plast Reconstr Surg. 2020.

Supporting Data / Figures





Thankyou

http://aidh.weill.cornell.edu/

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