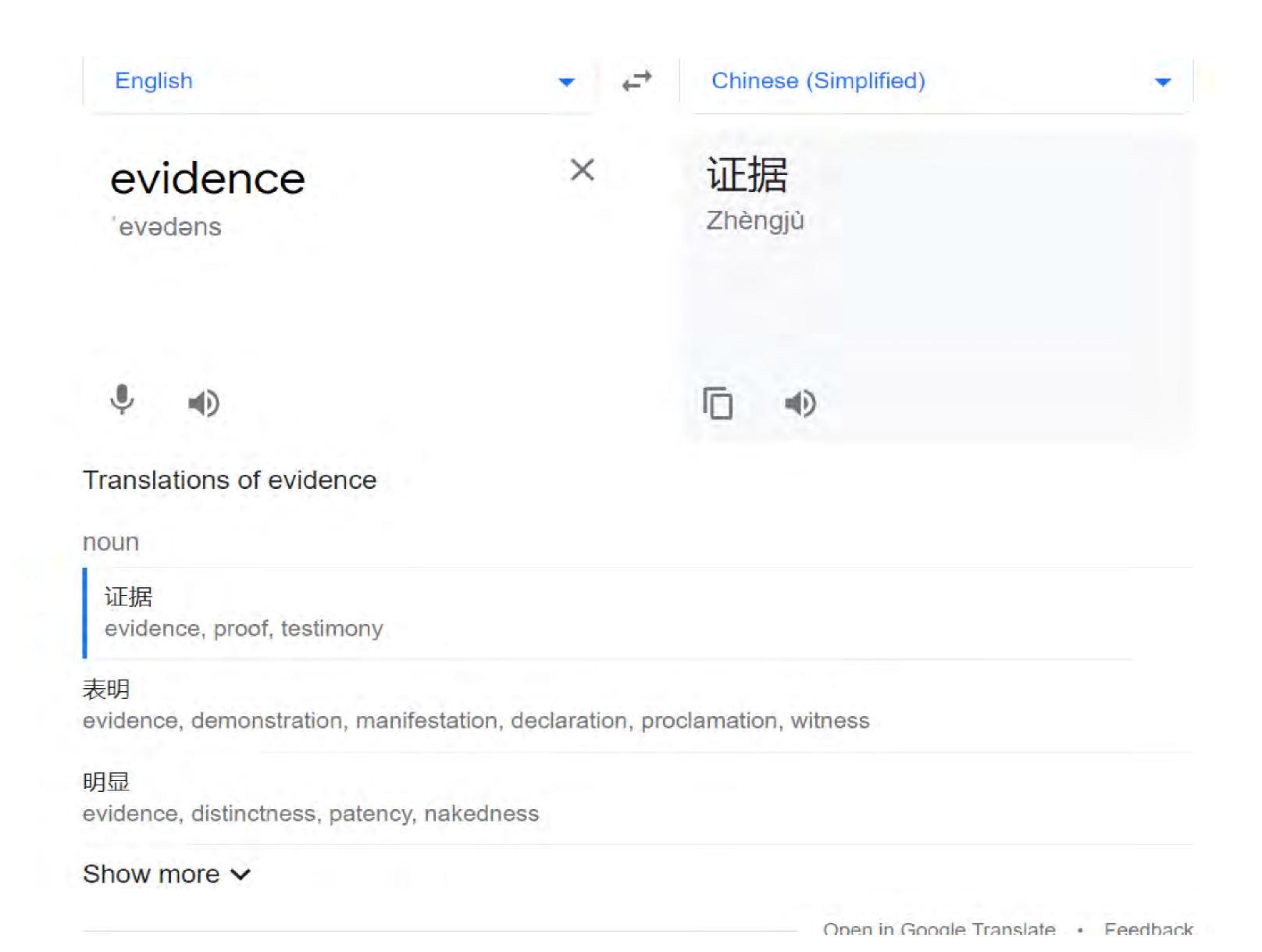
Inteligencia Artificial y salud

separando hechos de ficción

Ignacio H. Medrano

24 noviembre 2022



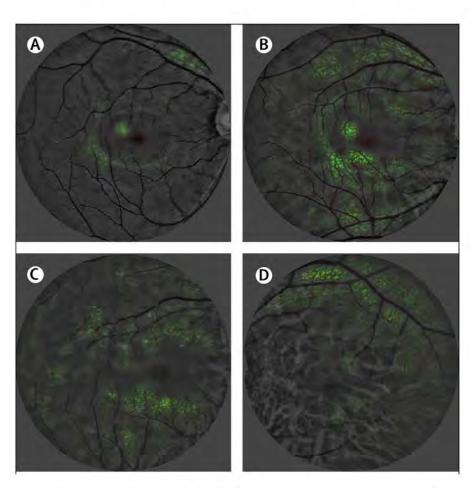
Machine learning

Set Inference Anticipation of of unseen problems



What the Machine Sees in the Retina

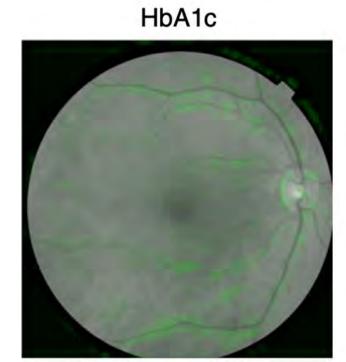
Kidney Disease



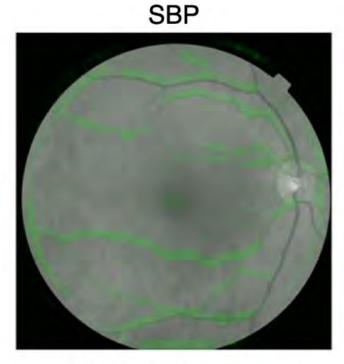
A deep learning algorithm to detect chronic kidney disease from retinal photographs in community-based populations

May 2020 Lancet Digital Health

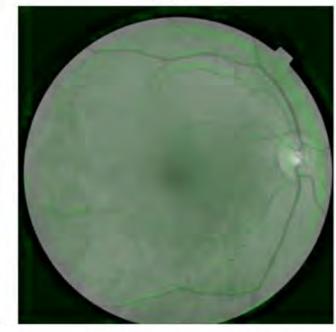
Diabetes and Blood Pressure Control



Actual: non-diabetic Predicted: 6.7%



Actual: 148.5 mmHg Predicted: 148.0 mmHg



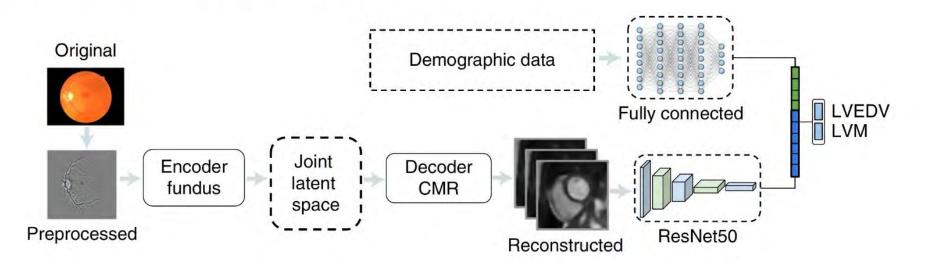
DBP

Actual: 78.5 mmHg Predicted: 86.6 mmHg

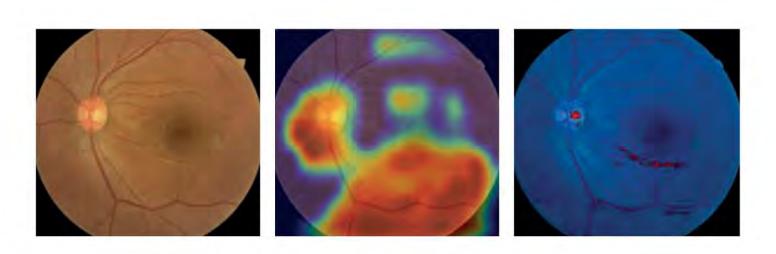
Prediction of cardiovascular risk factors from retinal fundus photographs via deep learning

biomedical engineering March 2018

Predicting heart attack



Liver and Gall Bladder Disease



Lancet Digit Health

Feb 2021

Alzheimer's Disease



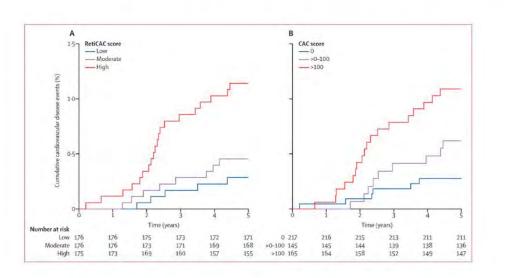
A system based on AI will scan the retina for signs of Alzheimer's





Lancet Digit Health : Sept 2022

Heart Calcium Score



Apr 2021 Lancet Digit Health

PLOS ONE



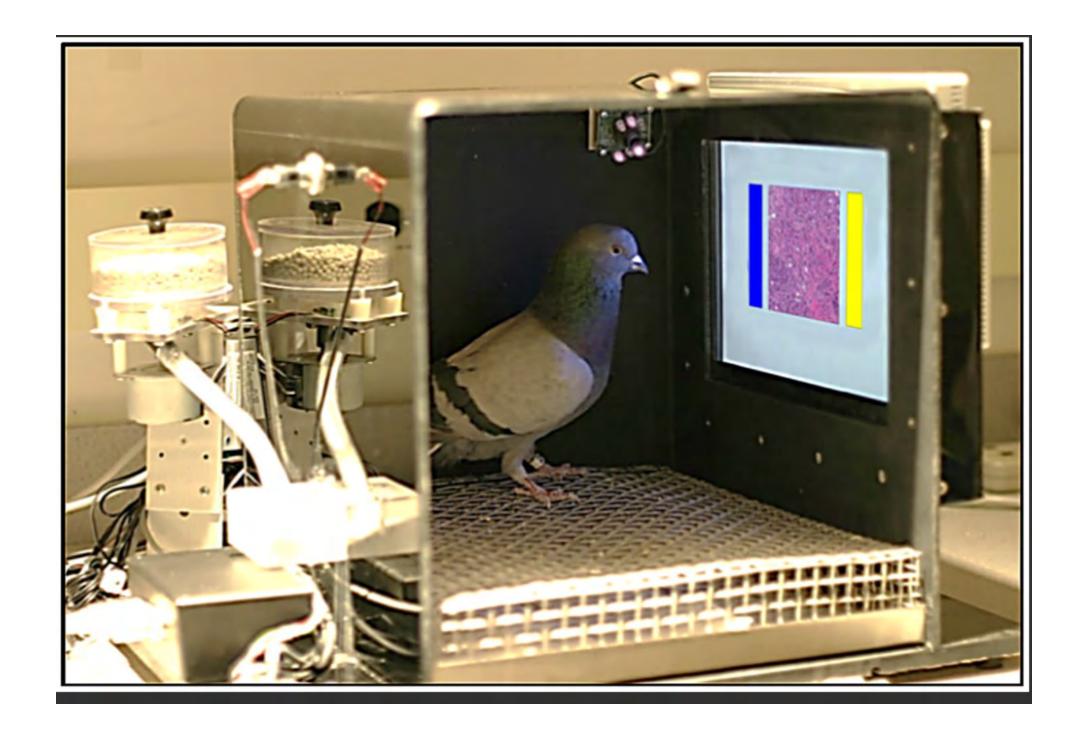


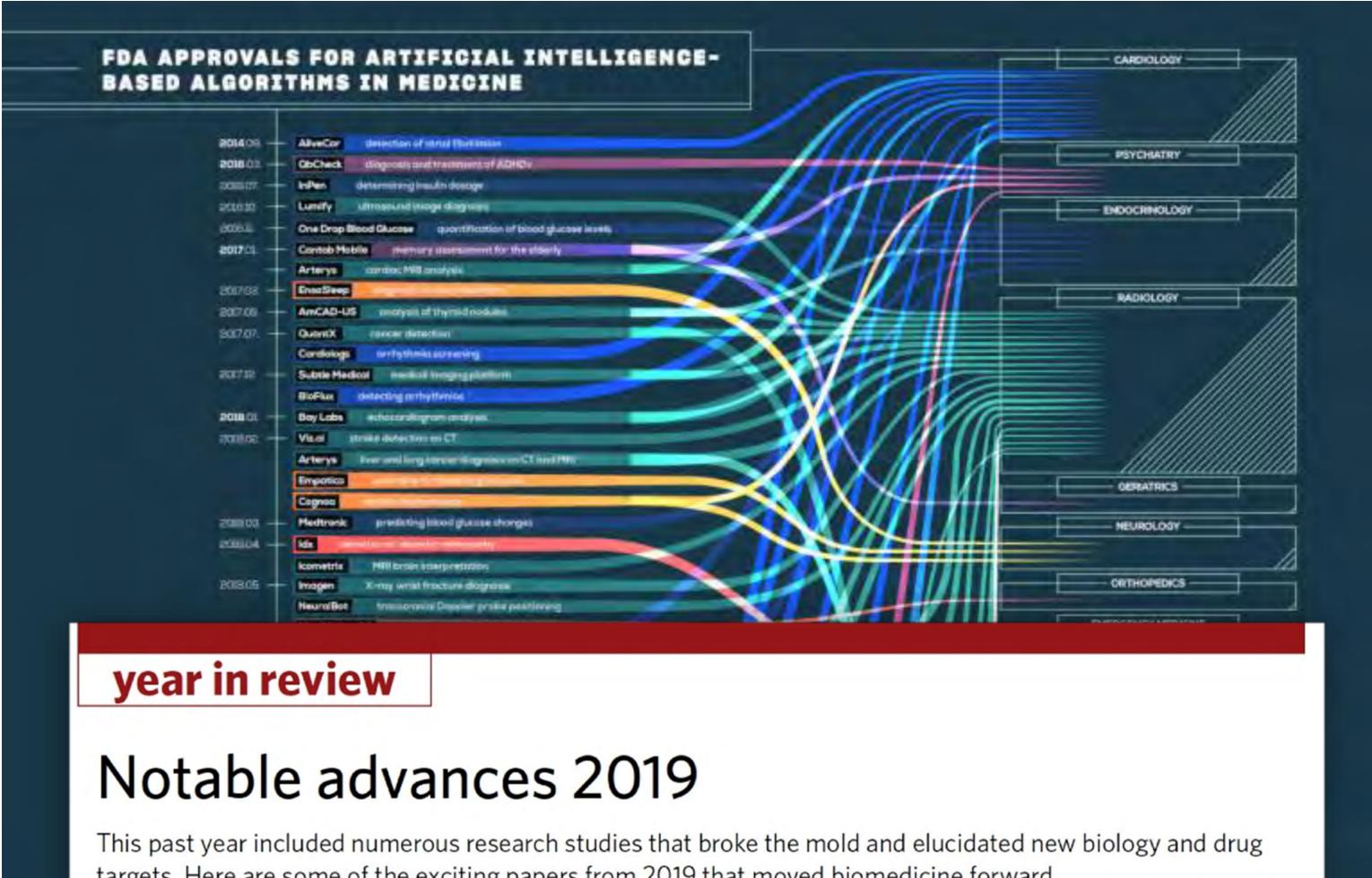
RESEARCH ARTICLE

Pigeons (*Columba livia*) as Trainable Observers of Pathology and Radiology Breast Cancer Images

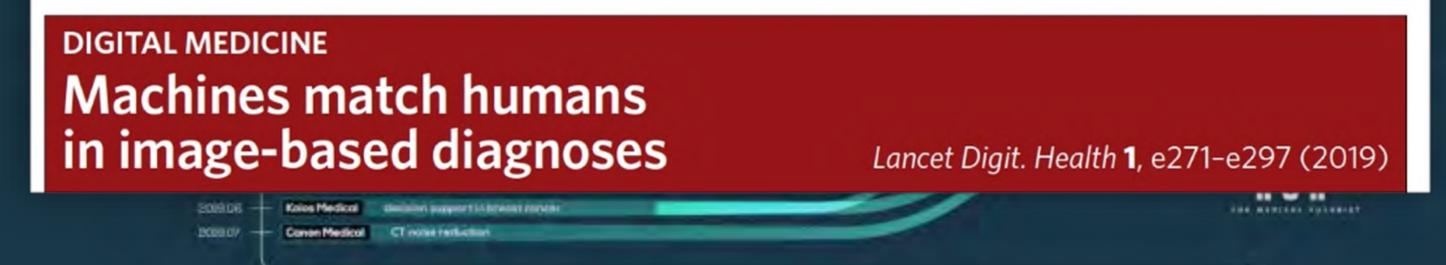
Richard M. Levenson , Elizabeth A. Krupinski, Victor M. Navarro, Edward A. Wasserman

Published: November 18, 2015 • https://doi.org/10.1371/journal.pone.0141357

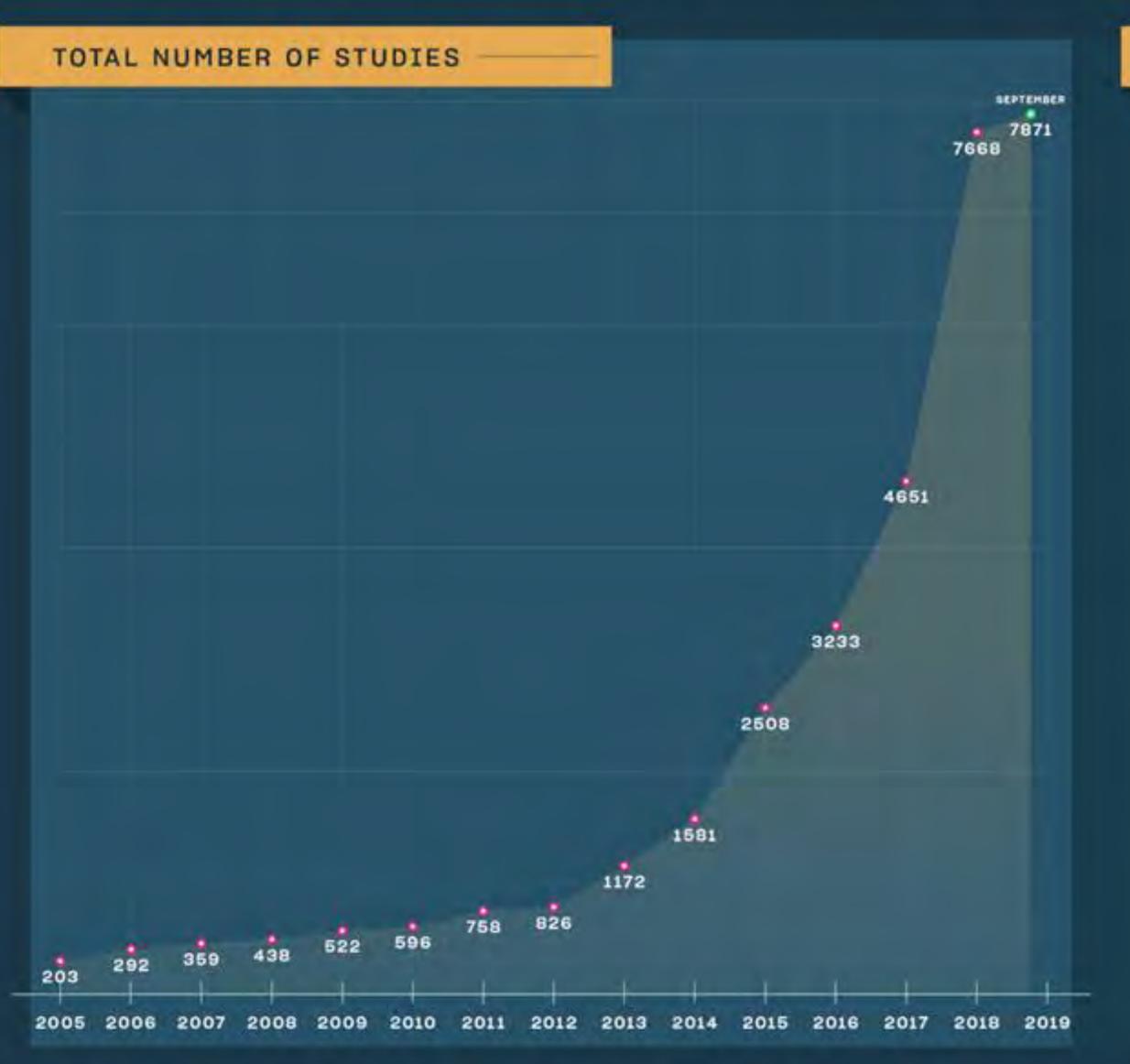


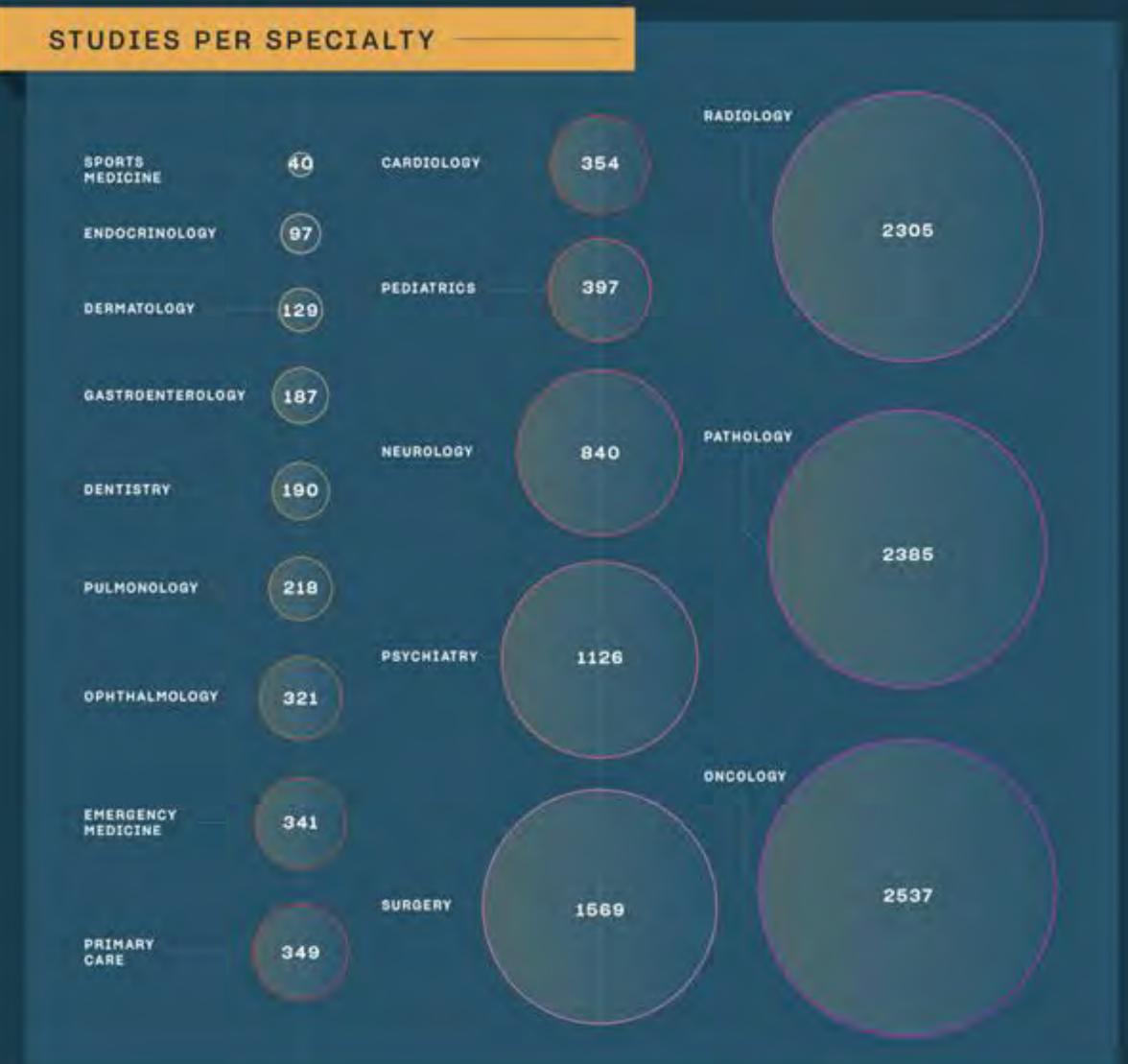


targets. Here are some of the exciting papers from 2019 that moved biomedicine forward.

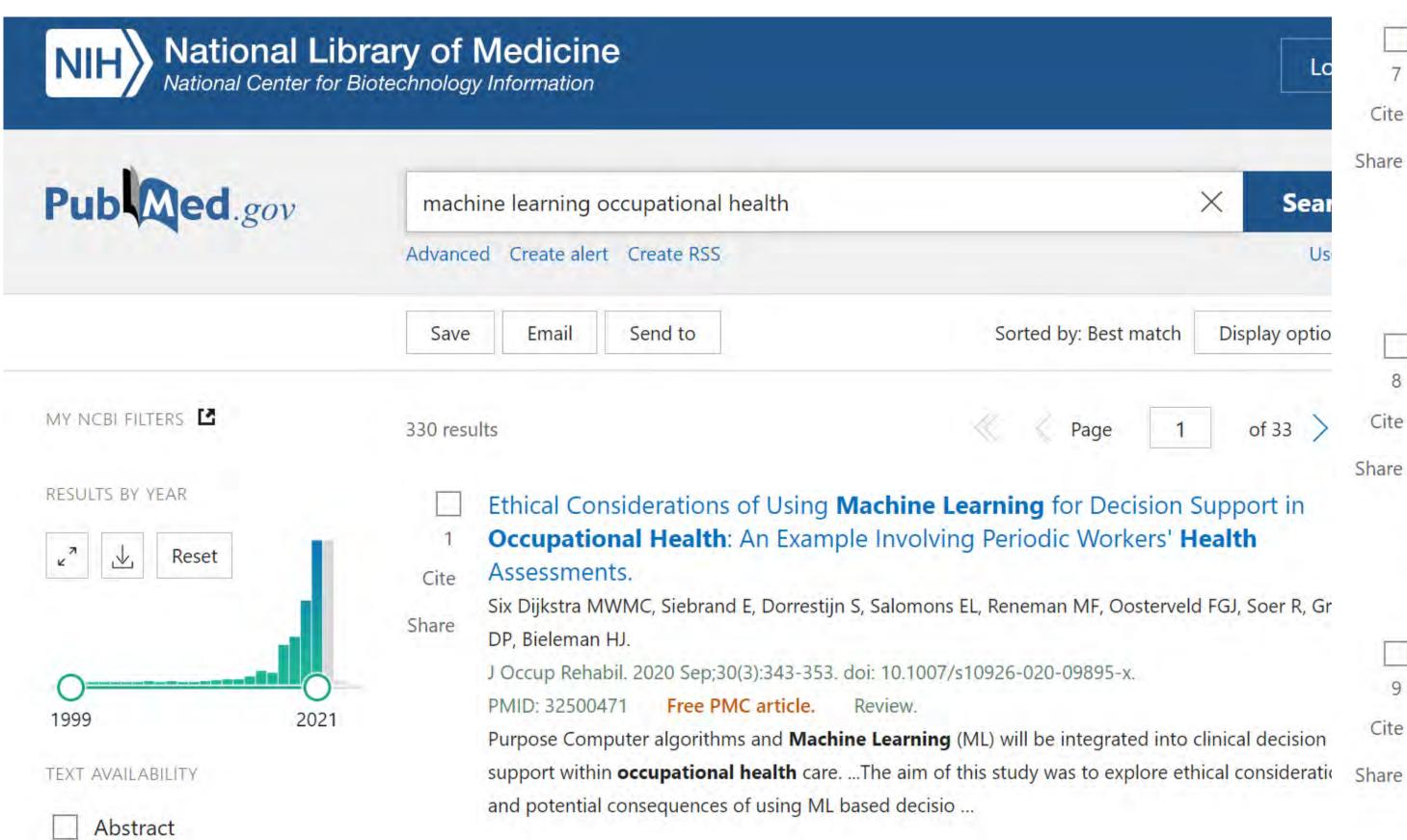


MACHINE AND DEEP LEARNING STUDIES ON PUBMED.COM









Machine Learning for Work Disability Prevention: Introduction to the Special Series. Gross DP, Steenstra IA, Harrell FE Jr, Bellinger C, Zaïane O. J Occup Rehabil. 2020 Sep;30(3):303-307. doi: 10.1007/s10926-020-09910-1. Share PMID: 32623556 Rapid development in computer technology has led to sophisticated methods of analyzing large datasets with the aim of improving human decision making. Artificial Intelligence and Machine Learning (ML) approaches hold tremendous potential for solving complex real-wor ... Intelligent Robotics Incorporating Machine Learning Algorithms for Improving Functional Capacity Evaluation and Occupational Rehabilitation. Fong J, Ocampo R, Gross DP, Tavakoli M. J Occup Rehabil. 2020 Sep;30(3):362-370. doi: 10.1007/s10926-020-09888-w. PMID: 32253595 Review. This paper reviews efforts to develop robotic FCE solutions that incorporate machine learning algorithms. Methods We reviewed the literature regarding rehabilitation robotics, with an emphasis on novel techniques incorporating robotics and machine learning ... The development of a machine learning algorithm to identify occupational injuries in agriculture using pre-hospital care reports. Scott E, Hirabayashi L, Levenstein A, Krupa N, Jenkins P. Health Inf Sci Syst. 2021 Jul 29;9(1):31. doi: 10.1007/s13755-021-00161-9. eCollection 2021 Dec.

This paper describes the development of a Naive Bayes machine learning algorithm to identify

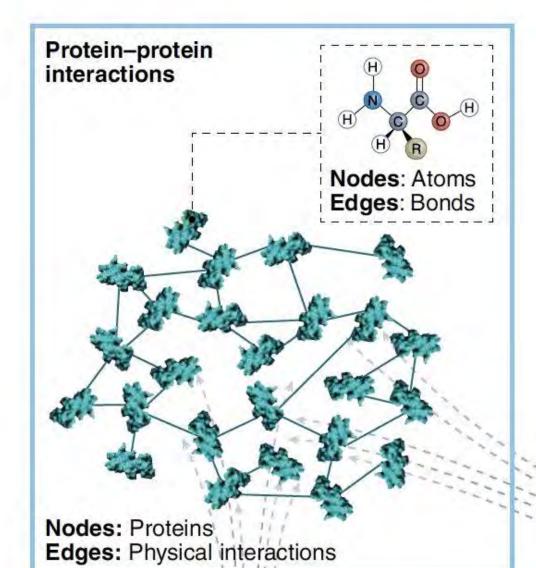
occupational injuries in agriculture using existing administrative data, specifically in pre-hospital care

Free PMC article.

reports (PCR). METHODS: A Naive Bayes machine lea ...

PMID: 34422257



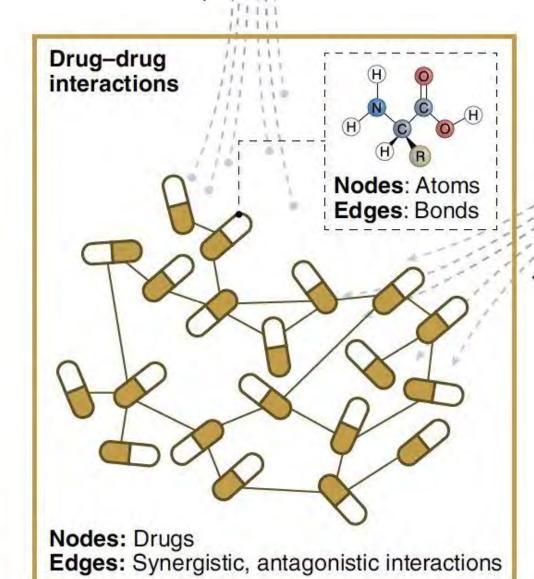


Is associated with

Disease associations

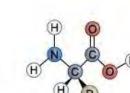
Nodes: Cells, tumours, lymph nodes Edges: Spatial proximity relationships

Spatial organization of cells and tissues



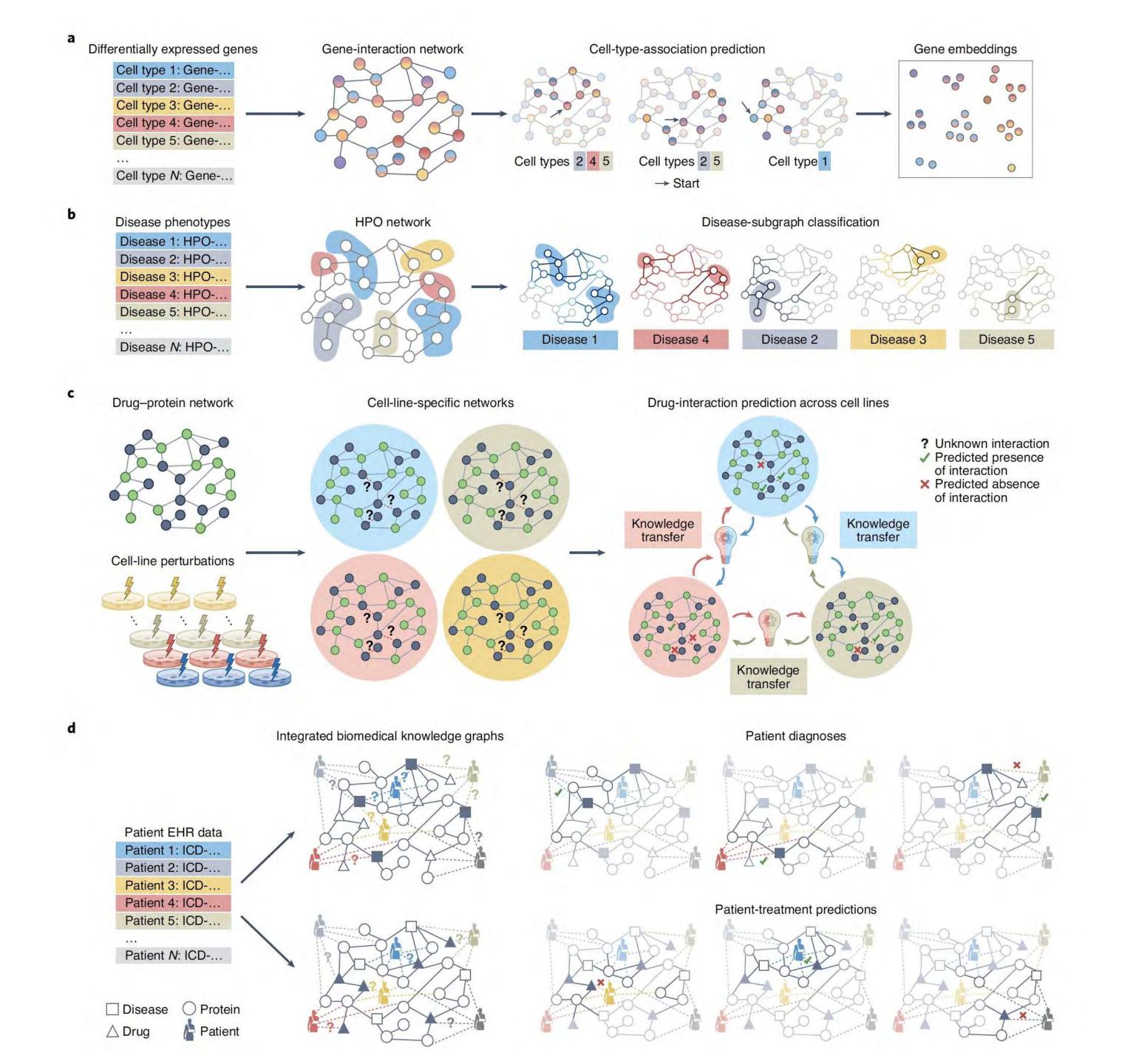
Nodes: Disease Edges: Disease co-morbidities

Healthcare knowledge Has phenotype

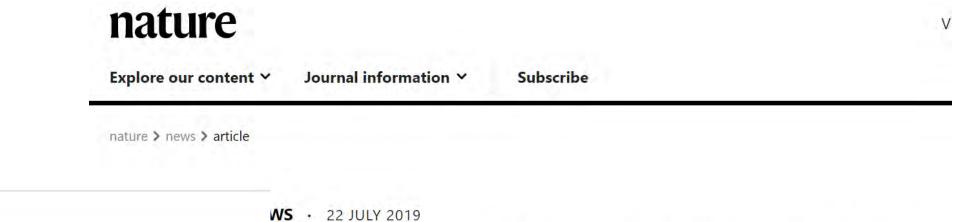




Nodes: Medical codes and concepts
Edges: Co-occurrences in patient records







Deep-learning-based prediction of late age-rela macular degeneration progression

Qi Yan[®], Daniel E. Weeks[®], Hongyi Xin¹, Anand Swaroop[®], Emily Y. Chew⁵, Heng Huar Ying Ding[®], and Wei Chen[®], Anand Swaroop[®], Emily Y. Chew⁵, Heng Huar

Both genetic and environmental factors influence the etiology of age-related macular degeneration (AMD), a leading

nature cancer

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<u>nature</u> > <u>nature cancer</u> > <u>articles</u> > article

Article Open Access | Published: 29 August 2022

Multimodal integration of radiology, pathology and genomics for prediction of response to PD-(L)1 blockade in patients with non-small cell lung cancer

Rami S. Vanguri, Jia Luo, Andrew T. Aukerman, Jacklynn V. Egger, Christopher J. Fong, Natally Horvat,
Andrew Pagano, Jose de Arimateia Batista Araujo-Filho, Luke Geneslaw, Hira Rizvi, Ramon Sosa, Kevin M.
Boehm, Soo-Ryum Yang, Francis M. Bodd, Katia Ventura, Travis J. Hollmann, Michelle S. Ginsberg, Jianjiong
Gao, MSK MIND Consortium, Matthew D. Hellmann, Jennifer L. Sauter 28 Sohrab P. Shah

Nature Cancer (2022) | Cite this article
7547 Accesses | 95 Altmetric | Metrics

I protein-folding algorithms solve tructures faster than ever

ep learning makes its mark on protein-structure prediction.

Article Open Access | Published: 17 December 2020

Multimodal fusion with deep neural networks for leveraging CT imaging and electronic health record: a case-study in pulmonary embolism detection

Shih-Cheng Huang [™], Anuj Pareek, Roham Zamanian, Imon Banerjee & Matthew P. Lungren

Scientific Reports 10, Article number: 22147 (2020) | Cite this article



www.savanamed.com

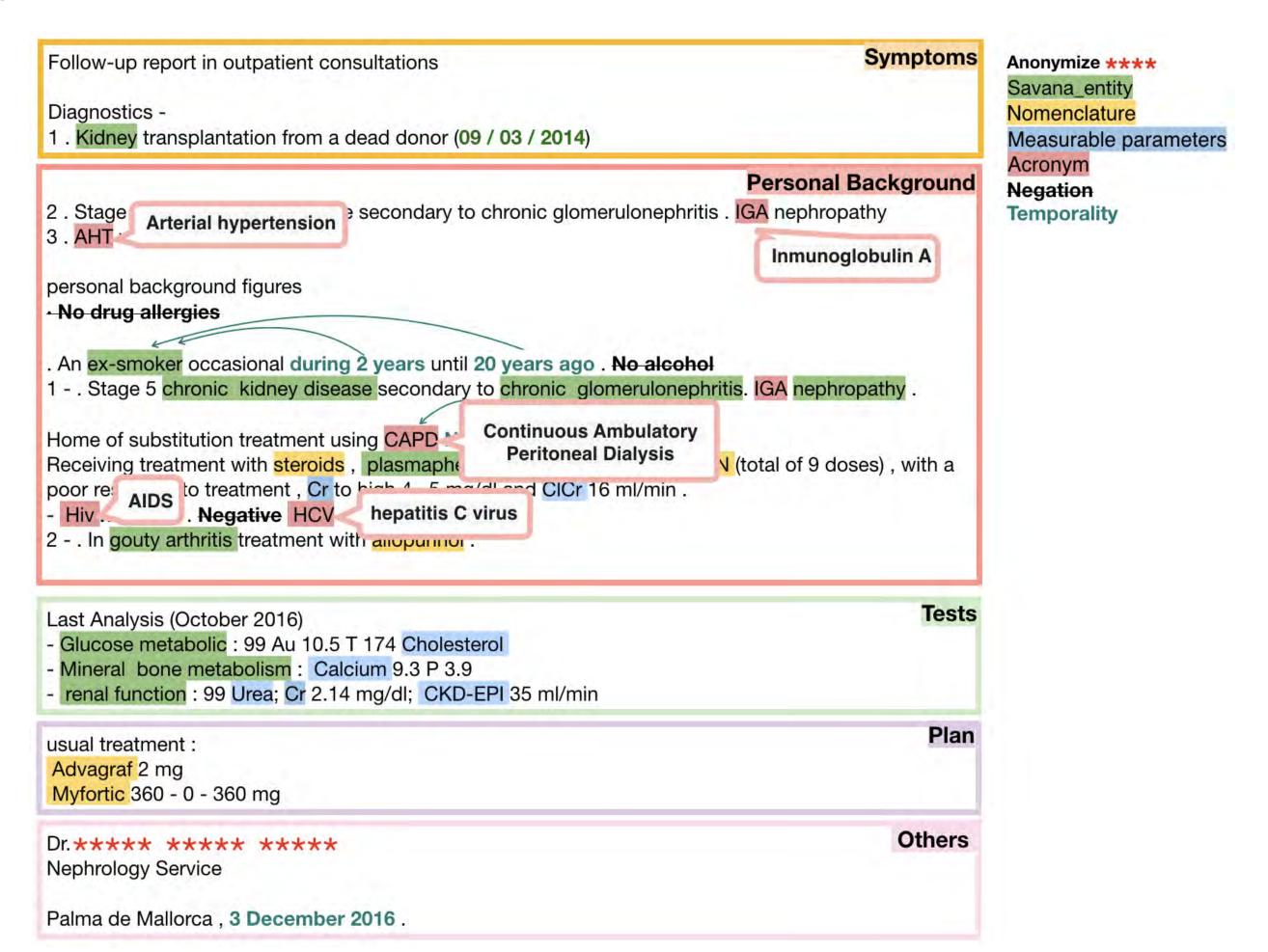


Clinical Natural Language Processing

Machi ne l earni ng appl i ed to records

Multi-language

Anonymization
Section Detection
NER (Named Entity Recognition)
Negation/Speculation
Temporality
NED (Named Entity
Disambiguation
AcronymNED



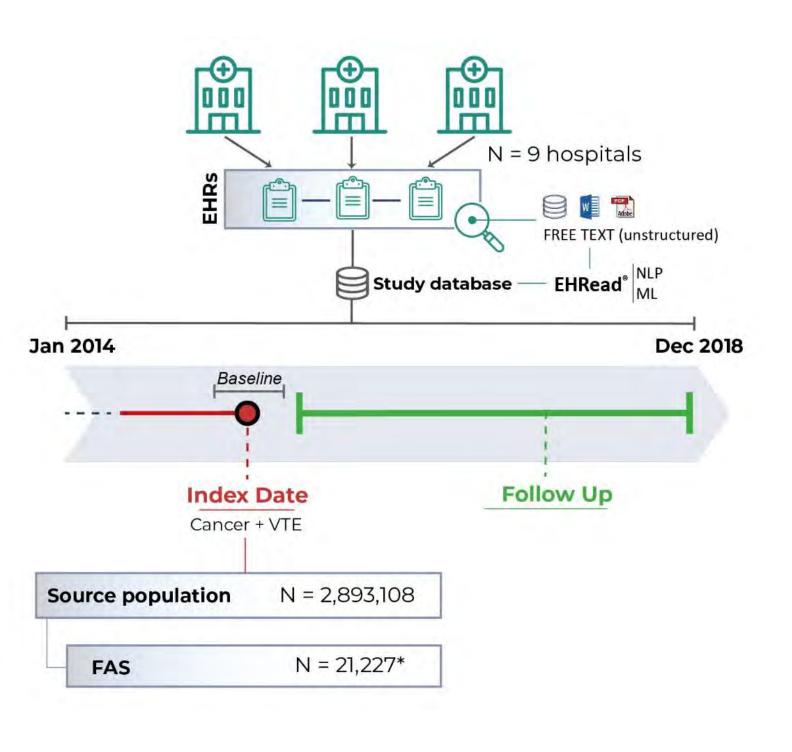
www.savanamed.com



Predicting major bleeding in Cancer+VTE patients treated with oral anticoagulants

A. Population selection

1. Data collection and processing



2. Model training and internal validation

N = 11,577N = 6,483N = 1,816N = 21,227N = 16,407FAS Index Date = Patient selection MB event OR Downsampling

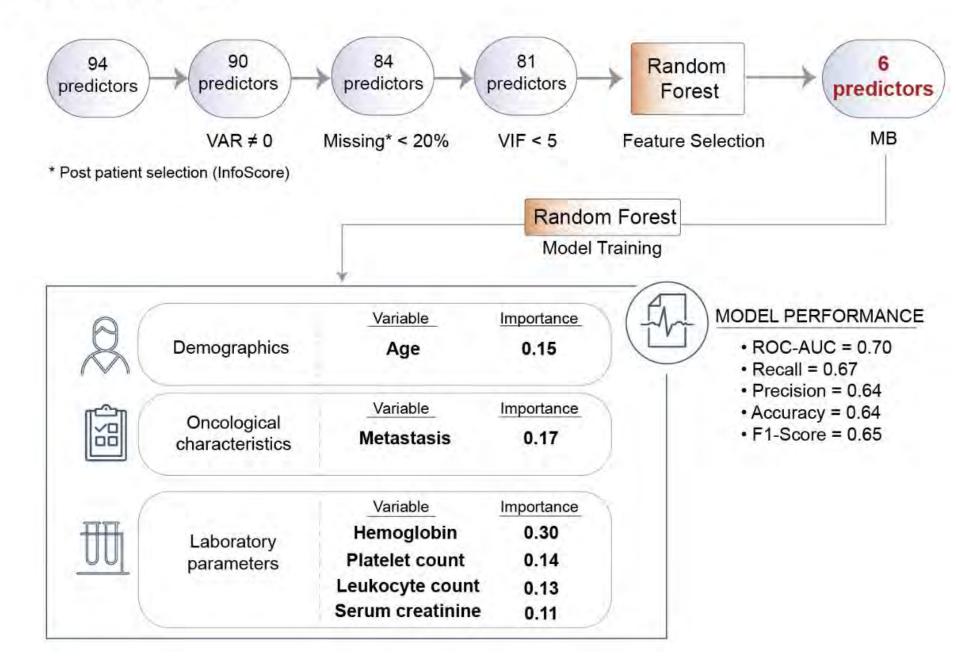
(InfoScore)

6-m follow-up AND

MB ≠ Index Date

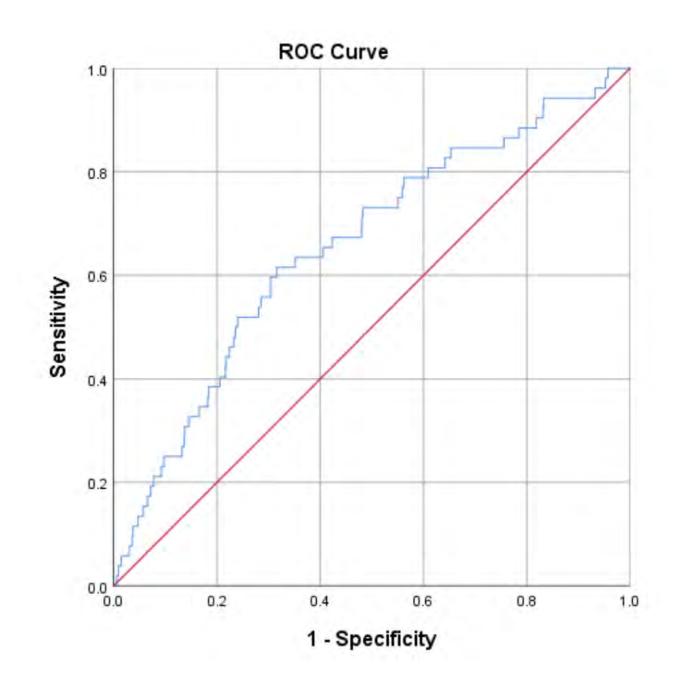
B. Predictors of MB

VTE diagnosis



3. External validation

Cohort of **2,218 patients** from a **prospective** cancer + thrombosis registry (TESEO) from the Spanish Society for Medical Oncology (SEOM)¹



¹ Muñoz AJ, et al. Clin Transl Oncol. 2020 Aug;22(8):1423-1424.

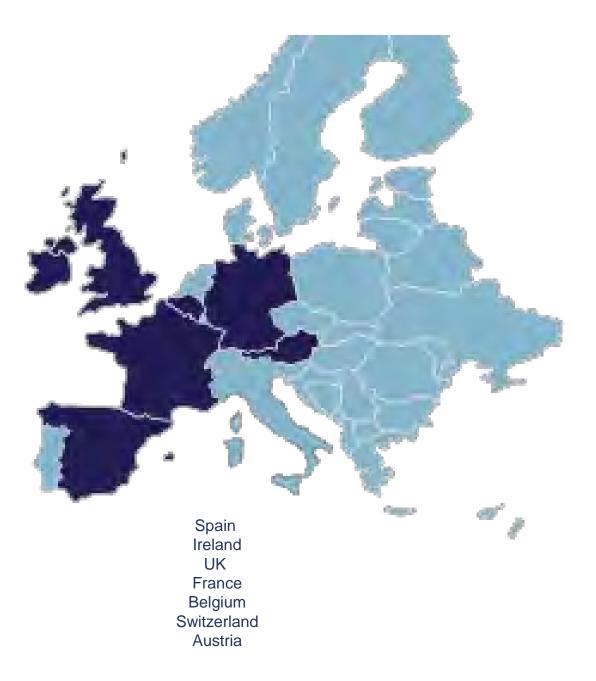




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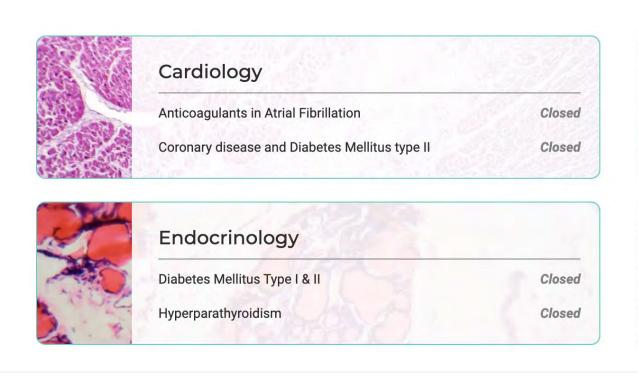


16

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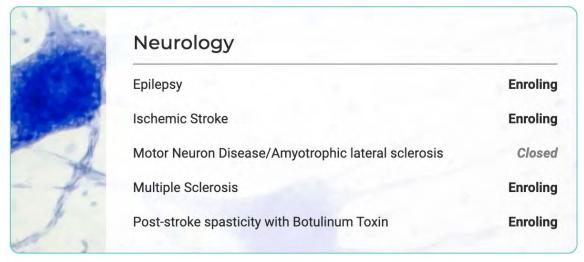
With high-validity virtual registries across 16 Therapeutic Areas.







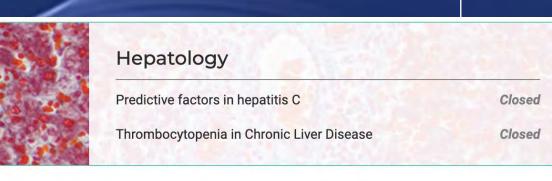












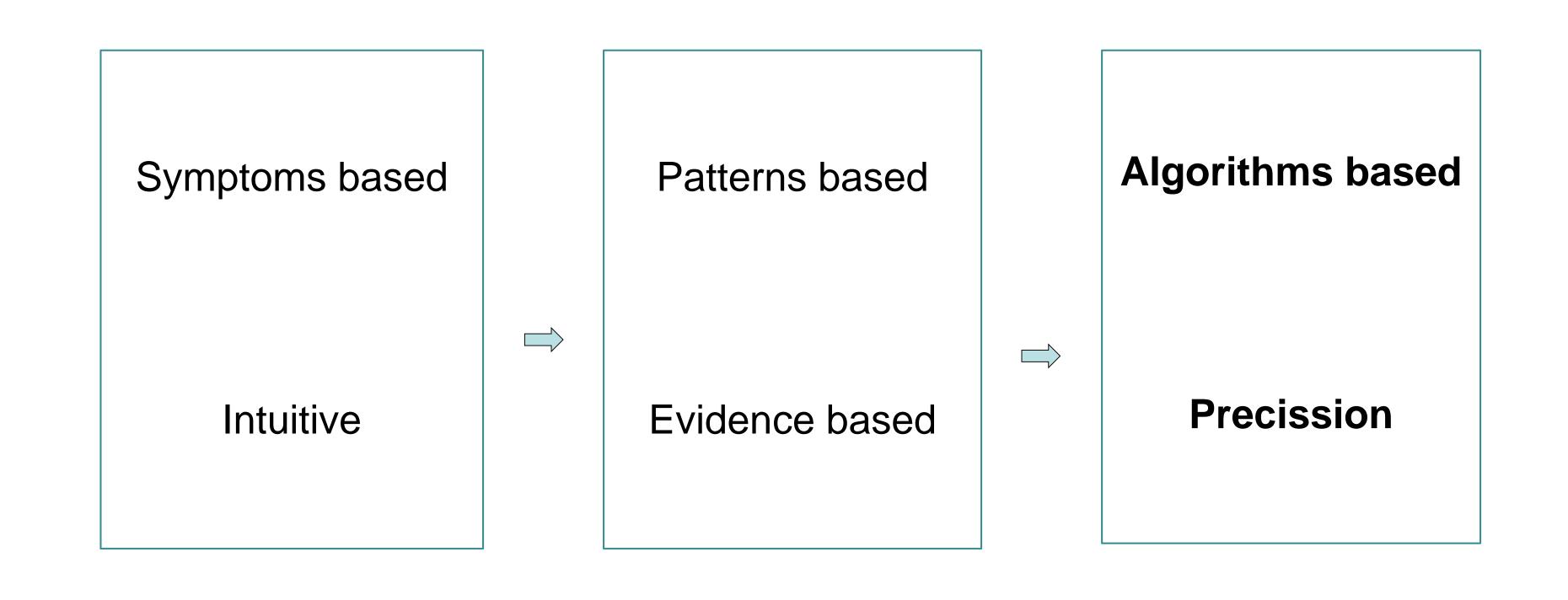


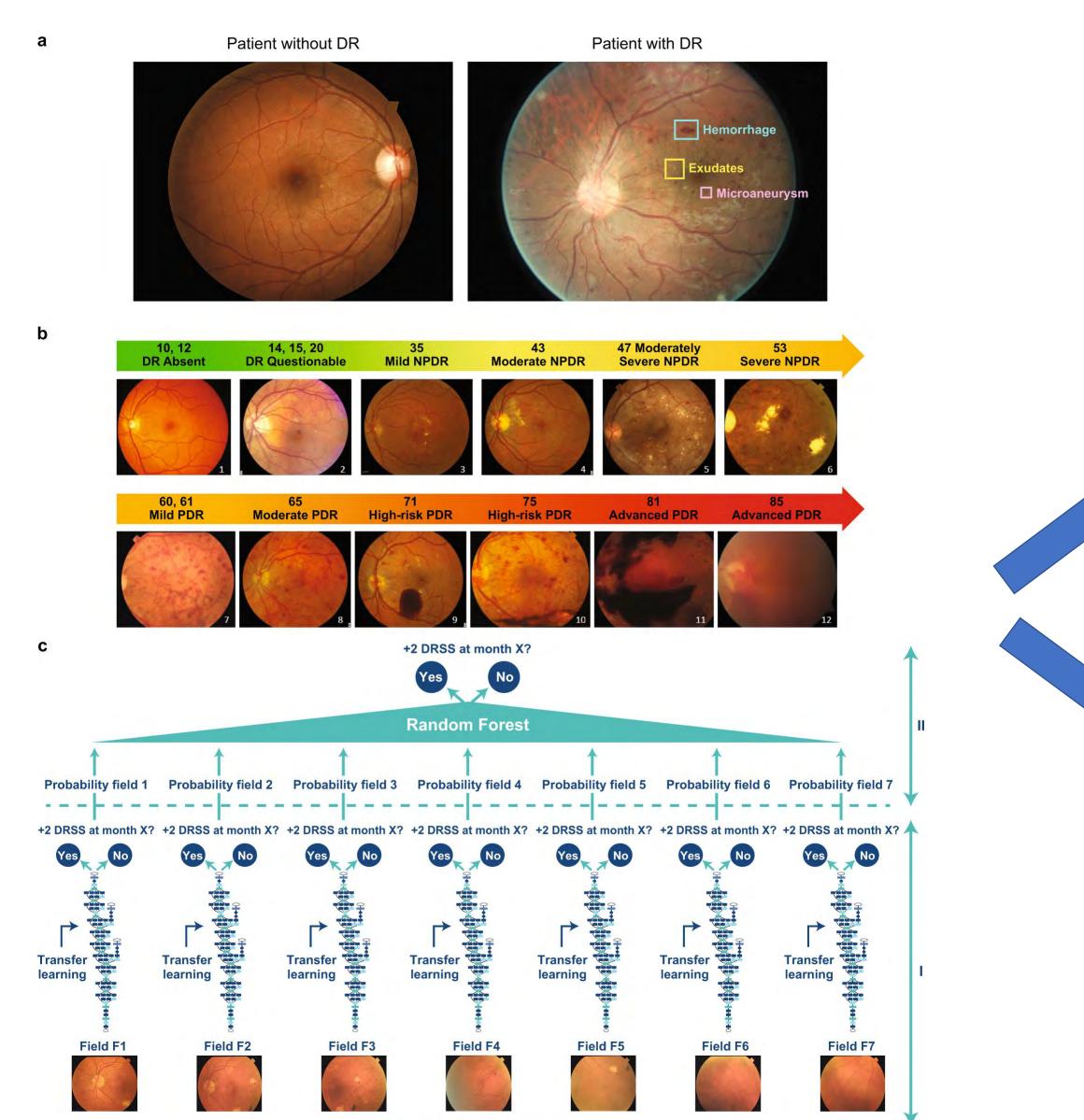












Patient's 7 CFP fields at baseline

September 3, 2020

Cost-effectiveness of Autonomous Point-of-Care Diabetic Retinopathy Screening for Pediatric Patients With Diabetes

Risa M. Wolf, MD¹; Roomasa Channa, MD²; Michael D. Abramoff, MD, PhD^{3,4,5,6,7}; et al

» Author Affiliations

JAMA Ophthalmol. Published online September 3, 2020. doi:10.1001/jamaophthalmol.2020.3190



FDA permits marketing of artificial intelligence-based device to detect certain diabetes-related eye problems

FDA News Release

For Immediate Release

A Human-Centered Evaluation of a Deep Learning System Deployed in Clinics for the Detection of Diabetic Retinopathy

Emma Beede Google Health Palo Alto, CA embeede@google.com

Anna Iurchenko Google Health Palo Alto, CA annaiu@google.com Elizabeth Baylor Google Health Palo Alto, CA ebaylor@google.com

Lauren Wilcox Google Health Palo Alto, CA Iwilcox@google.com

Laura M. Vardoulakis Google Health Palo Alto, CA

lauravar@google.com

Fred Hersch Google Health Singapore fredhersch@google.com

Paisan Ruamviboonsuk Rajavithi Hospital

Bangkok, Thailand paisan.trs@gmail.com COMMENT | VOLUME 393, ISSUE 10181, P1577-1579, APRIL 20, 2019

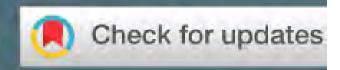


Purch

Reporting of artificial intelligence prediction models

Gary S Collins ☑ Karel G M Moons

Published: April 20, 2019 DOI: https://doi.org/10.1016/S0140-6736(19)30037-6



THE LANCET

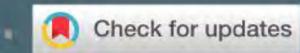
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PERSPECTIVES | DIGITAL MEDICINE | VOLUME 399, ISSUE 10325, P620, FEBRUARY 12, 2022

Bridging the chasm between AI and clinical implementation

Angela Aristidou 🖾 - Rajesh Jena - Eric J Topol

Published: February 12, 2022 DOI: https://doi.org/10.1016/S0140-6736(22)00235-5



Correspondence Published: 01 February 2021

DECIDE-AI: new reporting guidelines to bridge the development-to-implementation gap in clinical artificial intelligence

The DECIDE-Al Steering Group

Nature Medicine 27, 186–187(2021) Cite this article

Comment | Published: 09 September 2020

Minimum information about clinical artificial intelligence modeling: the MI-CLAIM checklist

Beau Norgeot, Giorgio Quer, Brett K. Beaulieu-Jones, Ali Torkamani, Raquel Dias, Milena Gianfrancesco, Rima Arnaout, Isaac S. Kohane, Suchi Saria, Eric Topol, Ziad Obermeyer, Bin Yu & Atul J. Butte

Nature Medicine 26, 1320–1324(2020) Cite this article

FEATURED

MINIMAR (MINimum Information for Medical AI Reporting): Developing reporting standards for artificial intelligence in health care 3

Tina Hernandez-Boussard ™, Selen Bozkurt, John P A Ioannidis, Nigam H Shah

Journal of the American Medical Informatics Association, Volume 27, Issue 12, December 2020, Pages 2011–2015, https://doi.org/10.1093/jamia/ocaa088

Published: 28 June 2020 Article history ▼



[Submitted on 21 Jul 2021]

Reading Race: Al Recognises Patient's Racial Identity In Medical Images

Imon Banerjee, Ananth Reddy Bhimireddy, John L. Burns, Leo Anthony Celi, Li-Ching Chen, Ramon Correa, Natalie Dullerud, Marzyeh Ghassemi, Shih-Cheng Huang, Po-Chih Kuo, Matthew P Lungren, Lyle Palmer, Brandon J Price, Saptarshi Purkayastha, Ayis Pyrros, Luke Oakden-Rayner, Chima Okechukwu, Laleh Seyyed-Kalantari, Hari Trivedi, Ryan Wang, Zachary Zaiman, Haoran Zhang, Judy W Gichoya

Background: In medical imaging, prior studies have demonstrated disparate AI performance by race, yet there is no known correlation for race on medical imaging that would be obvious to the human expert interpreting the images.

Methods: Using private and public datasets we evaluate: A) performance quantification of deep learning models to detect race from medical images, including the ability of these models to generalize to external environments and across multiple imaging modalities, B) assessment of possible confounding anatomic and phenotype population features, such as disease distribution and body habitus as predictors of race, and C) investigation into the underlying mechanism by which AI models can recognize race.

Findings: Standard deep learning models can be trained to predict race from medical images with high performance across multiple imaging modalities. Our findings hold under external validation conditions, as well as when models are optimized to perform clinically motivated tasks. We demonstrate this detection is not due to trivial proxies or imaging-related surrogate covariates for race, such as underlying disease distribution. Finally, we show that performance persists over all anatomical regions and frequency spectrum of the images suggesting that mitigation efforts will be challenging and demand further study.

Interpretation: We emphasize that model ability to predict self-reported race is itself not the issue of importance. However, our findings that AI can trivially predict self-reported race -- even from corrupted, cropped, and noised medical images -- in a setting where clinical experts cannot, creates an enormous risk for all model deployments in medical imaging: if an AI model secretly used its knowledge of self-reported race to misclassify all Black patients, radiologists would not be able to tell using the same data the model has access to.

THE LANCET Digital Health

The false hope of current approaches to explainable artificial intelligence in health care

Marzyeh Ghassemi, PhD Luke Oakden-Rayner Andrew L Beam, PhD Section 2019 DOI: https://doi.org/10.1016/S2589-7500(21)00208-9

Explainability

[Submitted on 21 Jul 2021]

Reading Race: Al Recognises Patient's Racial Identity In Medical Images

Imon Banerjee, Ananth Reddy Bhimireddy, John L. Burns, Leo Anthony Celi, Li-Ching Chen, Ramon Correa, Natalie Dullerud, Marzyeh Ghassemi, Shih-Cheng Huang, Po-Chih Kuo, Matthew P Lungren, Lyle Palmer, Brandon J Price, Saptarshi Purkayastha, Ayis Pyrros, Luke Oakden-Rayner, Chima Okechukwu, Laleh Seyyed-Kalantari, Hari Trivedi, Ryan Wang, Zachary Zaiman, Haoran Zhang, Judy W Gichoya

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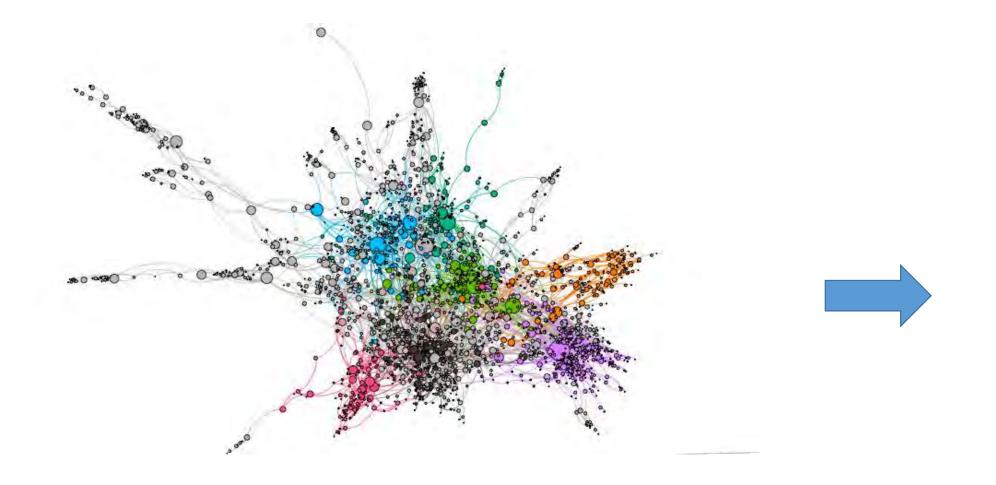
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THE LANCET Digital Health

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Marzyeh Ghassemi, PhD Luke Oakden-Rayner Andrew L Beam, PhD Access Published: November, 2021 DOI: https://doi.org/10.1016/S2589-7500(21)00208-9



JAMA Neurology Search All

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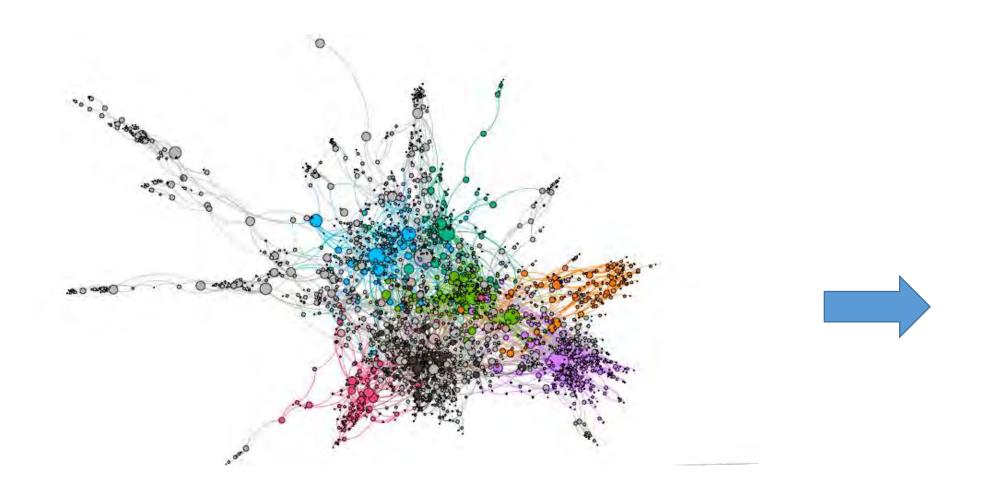
Original Investigation

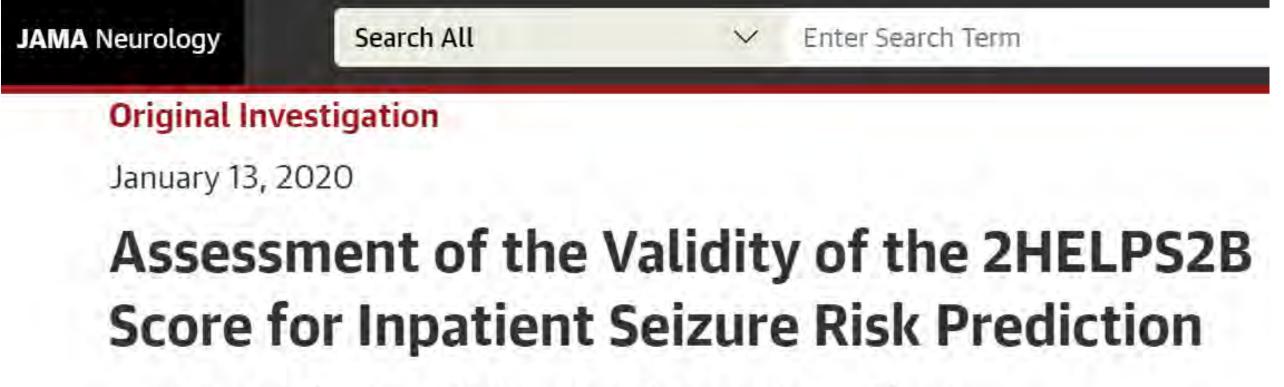
January 13, 2020

Assessment of the Validity of the 2HELPS2B Score for Inpatient Seizure Risk Prediction

Aaron F. Struck, MD¹; Mohammad Tabaeizadeh, MD²; Sarah E. Schmitt, MD³; <u>et al</u>

Interpretability





Aaron F. Struck, MD¹; Mohammad Tabaeizadeh, MD²; Sarah E. Schmitt, MD³; <u>et al</u>

Journal of Clinical Oncology > List of Issues > Newest Content >

ORIGINAL REPORTS | Breast Cancer

Multi-Institutional Validation of a Mammography-Based Breast Cancer Risk Model



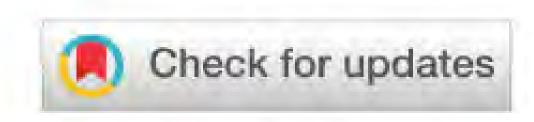
Adam Yala, MEng^{1,2} Peter G. Mikhael, BS^{1,2}; Fredrik Strand, MD, PhD^{3,4}; Gigin Lin, MD, PhD⁵; Siddharth Satuluru, BS⁶; Thomas Kim, MS⁷; ...

Transportability

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ORIGINAL REPORTS | Breast Cancer

Multi-Institutional Validation of a Mammography-Based Breast Cancer Risk Model



Adam Yala, MEng^{1,2} Peter G. Mikhael, BS^{1,2}; Fredrik Strand, MD, PhD^{3,4}; Gigin Lin, MD, PhD⁵; Siddharth Satuluru, BS⁶; Thomas Kim, MS⁷; ...

Research Letter

ONLINE FIRST

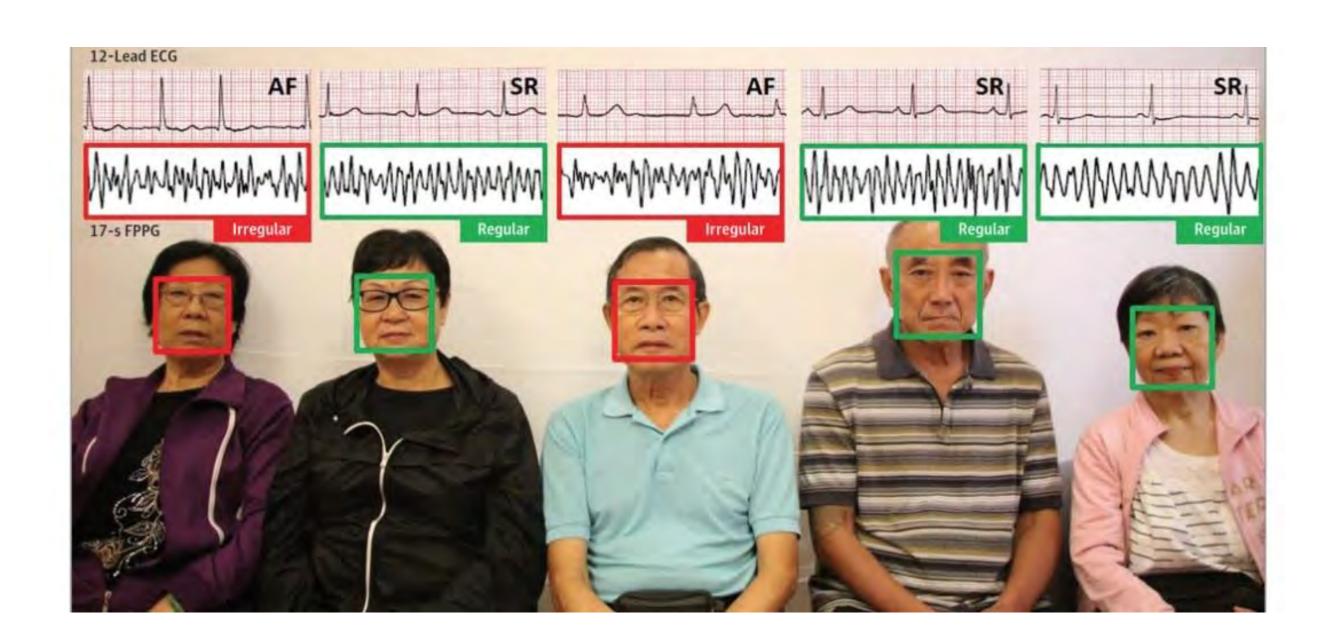
November 27, 2019

High-Throughput, Contact-Free Detection of Atrial Fibrillation From Video With Deep Learning

Bryan P. Yan, MD^{1,2,3}; William H. S. Lai, BSc(Hons)¹; Christy K. Y. Chan, MSc¹; et al.

» Author Affiliations | Article Information

JAMA Cardiol. Published online November 27, 2019. doi:https://doi.org/10.1001/jamacardio.2019.4004





Editor's Note

November 27, 2019

Diagnosing With a Camera From a Distance— Proceed Cautiously and Responsibly

Mintu P. Turakhia, MD, MAS^{1,2,3}

> Author Affiliations | Article Information

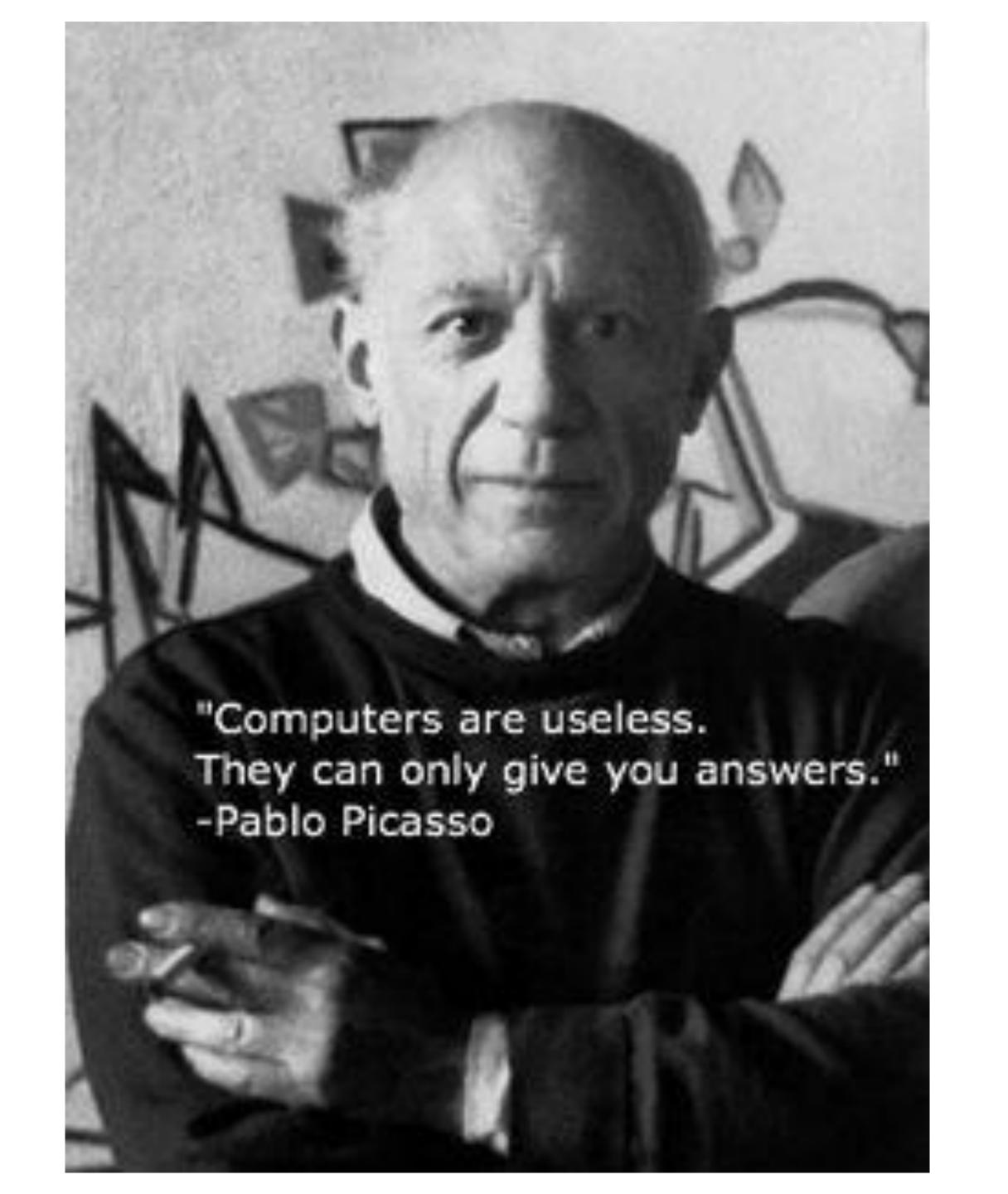
JAMA Cardiol. Published online November 27, 2019. doi:https://doi.org/10.1001/jamacardio.2019.4572



A Buyer's Guide to Al in Health and Care

10 questions for making well-informed procurement decisions about products that use Al

SEPTEMBER 2020





- ihmedrano@savanamed.com
- Ignacio Hernández Medrano

E-mails semanales (muy breves) sobre IA e investigación médica en savanamed.com