

From AI Bias to AI by Us

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Peter Dauvergne  

Pages 696-718 | Published online: 03 Sep 2020



The Human Factor in AI-Based Decision-Making

Facing identical AI inputs, individuals make entirely different choices based on their own decision-making styles.



Research

Electronic health record alerts for acute kidney injury: multicenter, randomized clinical trial

BMJ 2021 ;372 doi: <https://doi.org/10.1136/bmj.m4786> (Published 18 January 2021)

Cite this as: *BMJ* 2021;372:m4786

Opinion

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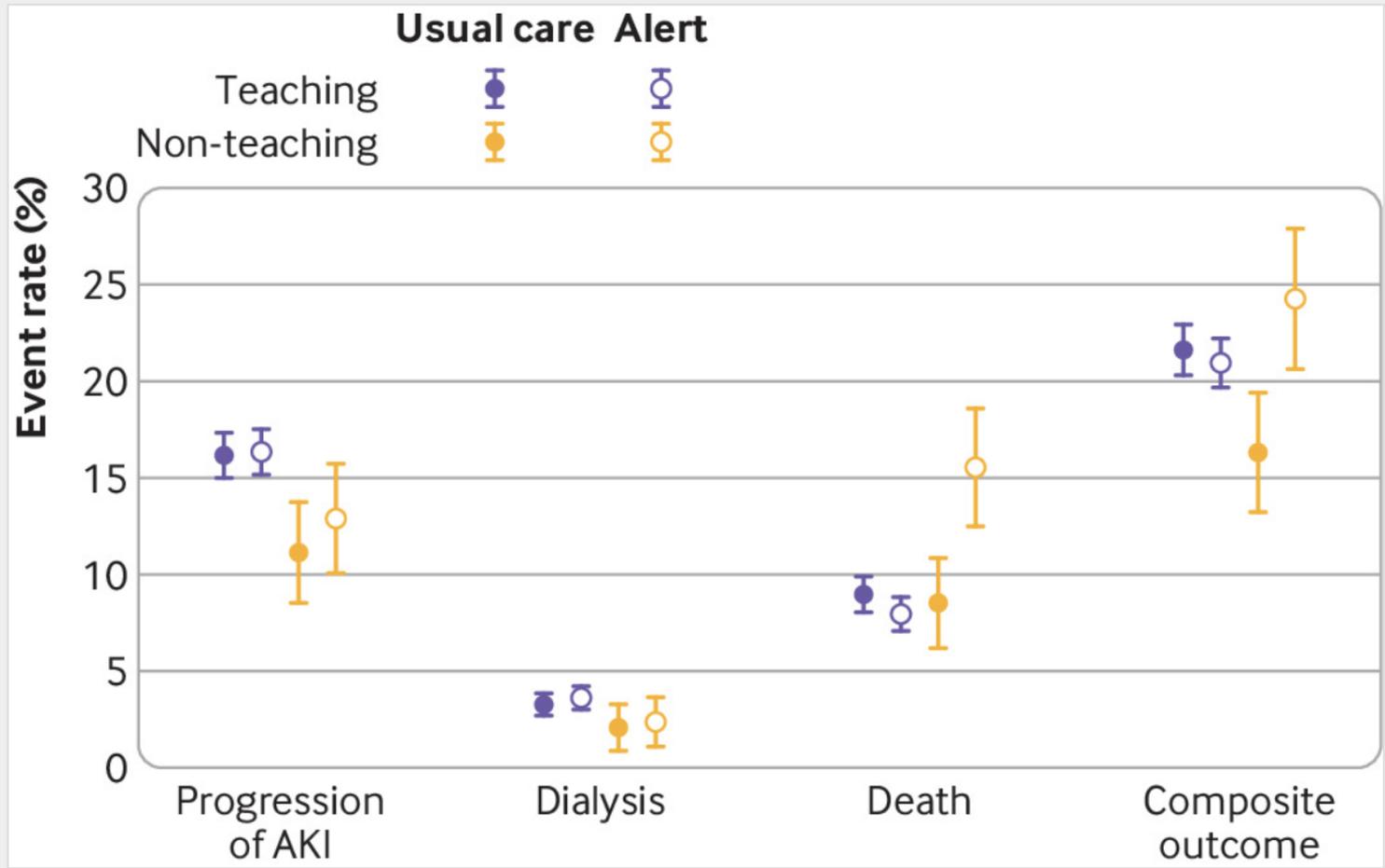


Fig 2

Primary and secondary outcome events, stratified by hospital type. Error bars are 95% confidence intervals of the observed proportion of events. AKI=acute kidney injury



Does AI Help or Hurt Human Radiologists' Performance? It Depends on the Doctor

New research shows radiologists and AI don't always work well together

By EKATERINA PESHEVA | March 19, 2024 | [Research](#)



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[Feiyang Yu](#), [Alex Moehring](#), [Oishi Banerjee](#), [Tobias Salz](#), [Nikhil Agarwal](#) & [Pranav Rajpurkar](#) 

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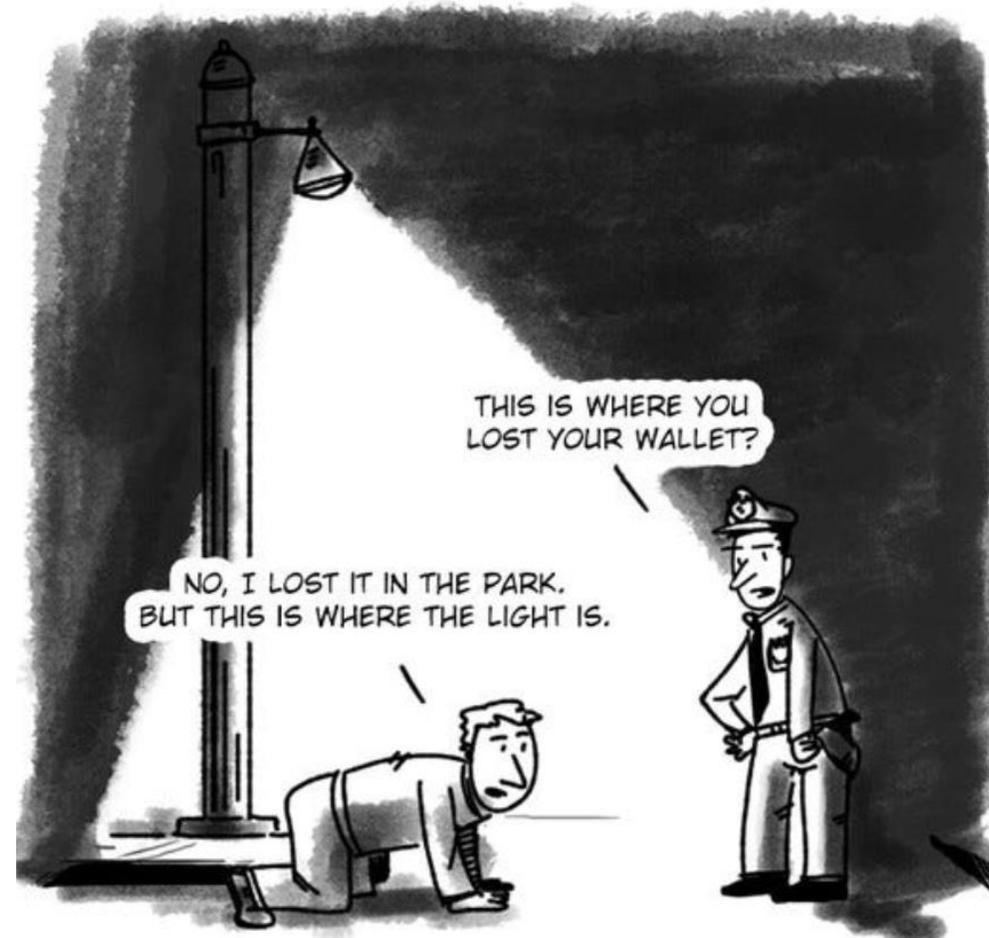
Original Research | Neuroradiology/Head and Neck Imaging | September 4, 2024

Prospective Evaluation of Artificial Intelligence Triage of Intracranial Hemorrhage on Noncontrast Head CT Examinations

Authors: Cody H. Savage, MD, Manoj Tanwar, MD, Asser Abou Elkasseem, MD, Adam Sturdivant, MPH, MS, Omar Hamki, BS, Houman Sotoudeh, MD, Gopi Sirineni, MD, Aparna Singhal, MD, Desmin Milner, MD, Jesse Jones, MD, Dirk Rehder, MD, Mei Li, PhD, Yufeng Li, PhD, Kevin Junck, PhD, Srini Tridandapani, MD, PhD, MBA, Steven A. Rothenberg, MD, and Andrew D. Smith, MD, PhD  [SHOW FEWER](#) | [AUTHOR INFO & AFFILIATIONS](#)



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Critical Bias in Critical Care Devices

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Journal of Biomedical Informatics

Volume 153, May 2024, 104643



Special Communication

Variation in monitoring: Glucose measurement in the ICU as a case study to preempt spurious correlations

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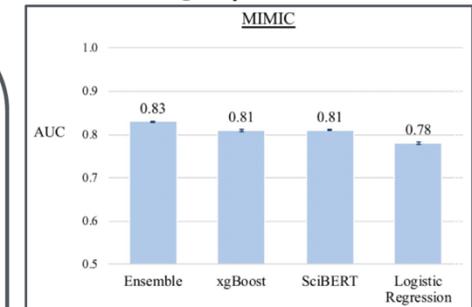
Articles

AI recognition of patient race in medical imaging: a modelling study

Judy Wawira Gichoya MD^a, Imon Banerjee PhD^c, Ananth Reddy Bhimireddy MS^a, John L Burns MS^d, Leo Anthony Celi MD^{e, g}, Li-Ching Chen BS^h, Ramon Correa BS^c, Natalie Dullerud MSⁱ, Marzyeh Ghassemi PhD^{e, f}, Shih-Cheng Huang^j, Po-Chih Kuo PhD^h, Matthew P Lungren MD^j, Lyle J Palmer PhD^{k, l}, Brandon J Price MDⁿ, Saptarshi Purkayastha PhD^d, Ayis T Pyrros MDⁿ, Lauren Oakden-Rayner MD^k, Chima Okechukwu MS^o ... Haoran Zhang MSⁱ

Nursing Progress Note

NEURO: sedated with propofol gtt 85mcg/kg
 RESP: remains intubated with IMV 12/750/5peep/5psv/40%fio2
 GU: inc large amt foul smelling urine foley placed with UO ~50cc/hr, **dialysis** to be initiated at 6pm
 SKIN: sacral decub w-d dsg changes **wound red** beefy, small amt bloody drainage, heel dsg w-d dsg changed no drainage
 ACCESS: left EJ, right groin introducer, left rad aline
 PLAN: **dialysis** this eve, wean extubate tomorrow, titrate up po meds for **hypertension**



... for difficult reasons.

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and difficult	3.32%	2.90%
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An artificial intelligence system predicted the sex of people just by analyzing their eyes

It is a model based on deep learning that was trained with photos of retinas. Applications in the field of medicine

Newsroom Infobae

March 15, 2022



ORIGINAL ARTICLE DATA SCIENCE | VOLUME 19, ISSUE 1, P184-191, JANUARY 01, 2022

Detecting Racial/Ethnic Health Disparities Using Deep Learning From Frontal Chest Radiography

Ayis Pyrros, MD   • Jorge Mario Rodríguez-Fernández, MD • Stephen M. Borstelmann, MD •
Judy Wawira Gichoya, MD • Jeanne M. Horowitz, MD • Brian Fornelli, MS • Nasir Siddiqui, MD •
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DOI: <https://doi.org/10.1016/j.jacr.2021.09.010> •  Check for updates





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Explaining the Predictions of Any Classifier

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66 years after the 1956 Dartmouth Conference



1956 Dartmouth Conference: The Founding Fathers of AI



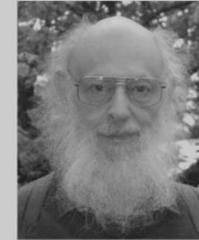
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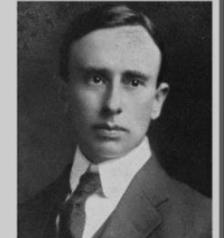
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