

Enhancing Clinical Care by Developing and Deploying AI within a Health Care System

Intelligent Health 2022

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Headliner Use Case 9, Sep 8, 2.20 pm

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Heart Failure

Article | [Published: 25 March 2020](#)

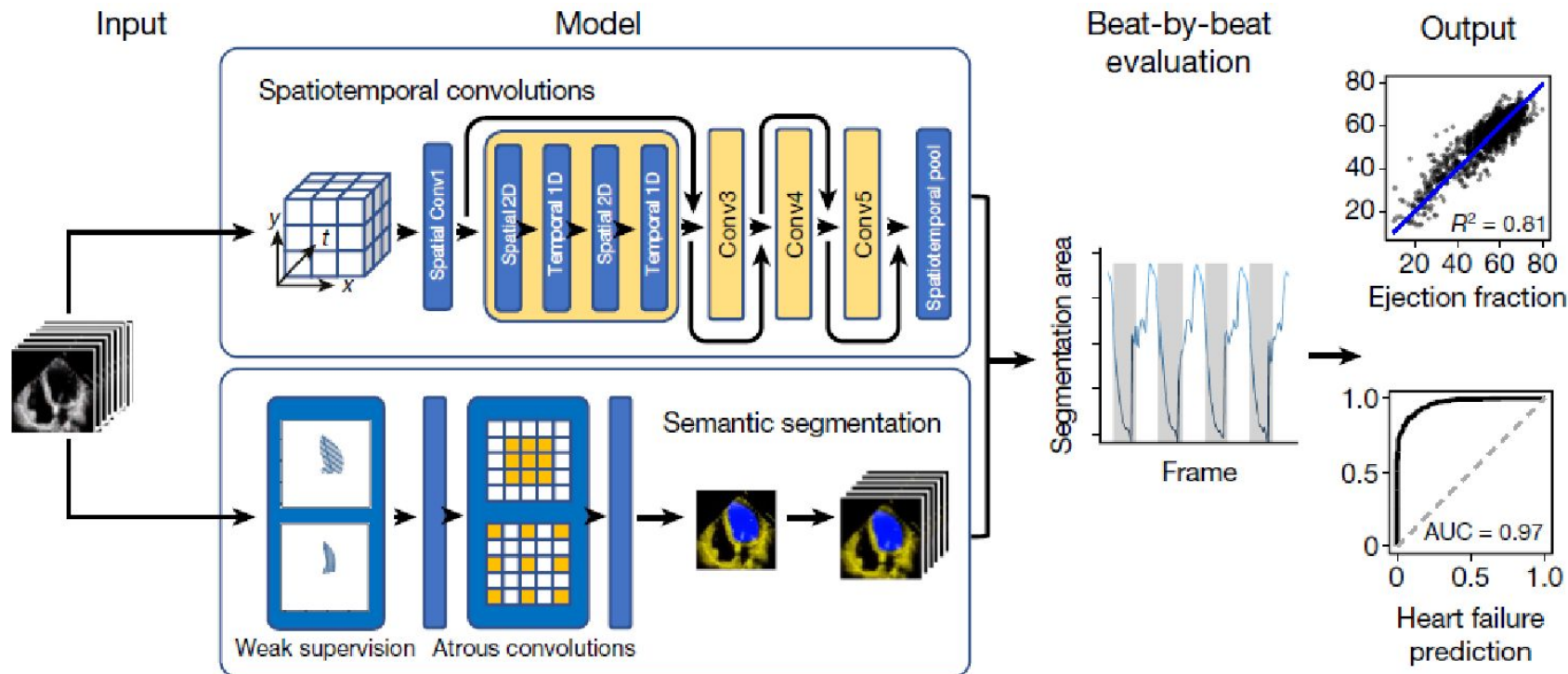
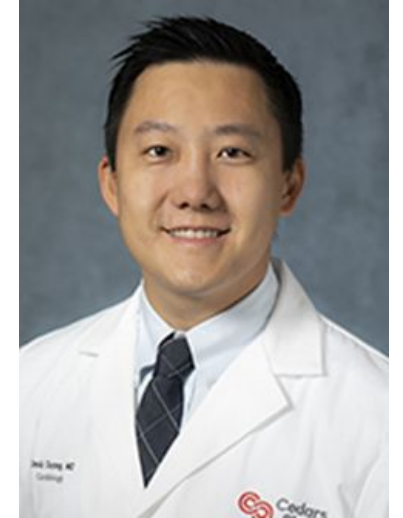
Video-based AI for beat-to-beat assessment of cardiac function

[David Ouyang](#) , [Bryan He](#), [Amirata Ghorbani](#), [Neal Yuan](#), [Joseph Ebinger](#), [Curtis P. Langlotz](#), [Paul A. Heidenreich](#), [Robert A. Harrington](#), [David H. Liang](#), [Euan A. Ashley](#) & [James Y. Zou](#) 

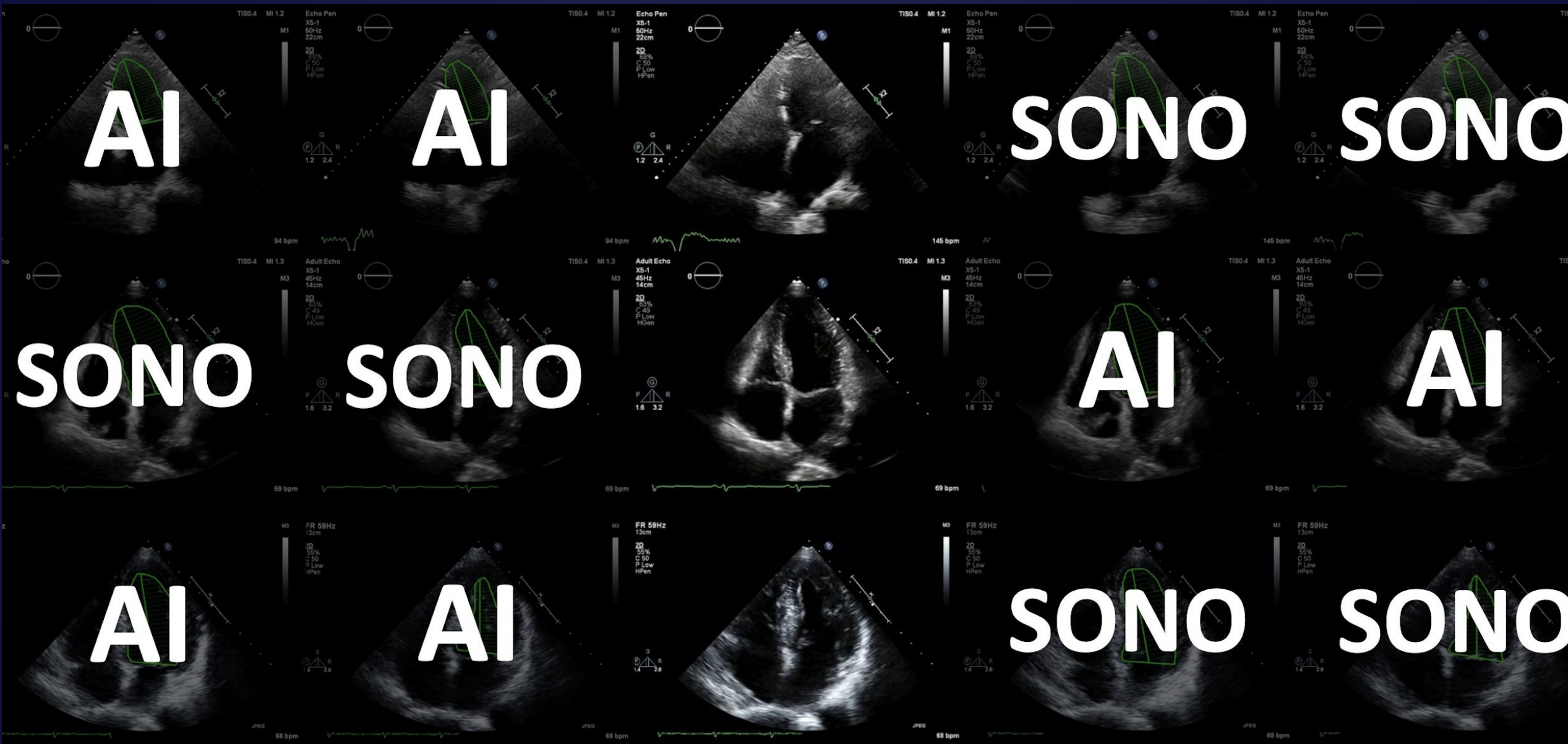
Nature **580**, 252–256 (2020) | [Cite this article](#)

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D. Ouyang

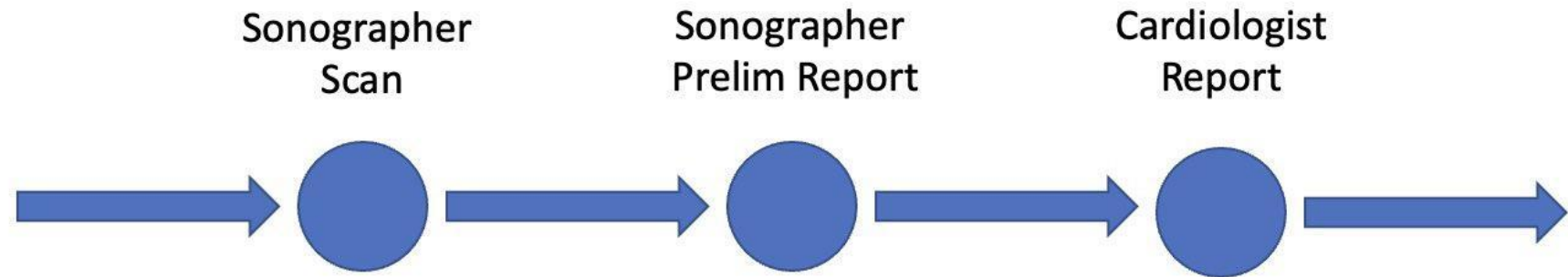


Ouyang D, et al. *Nature* (2020).

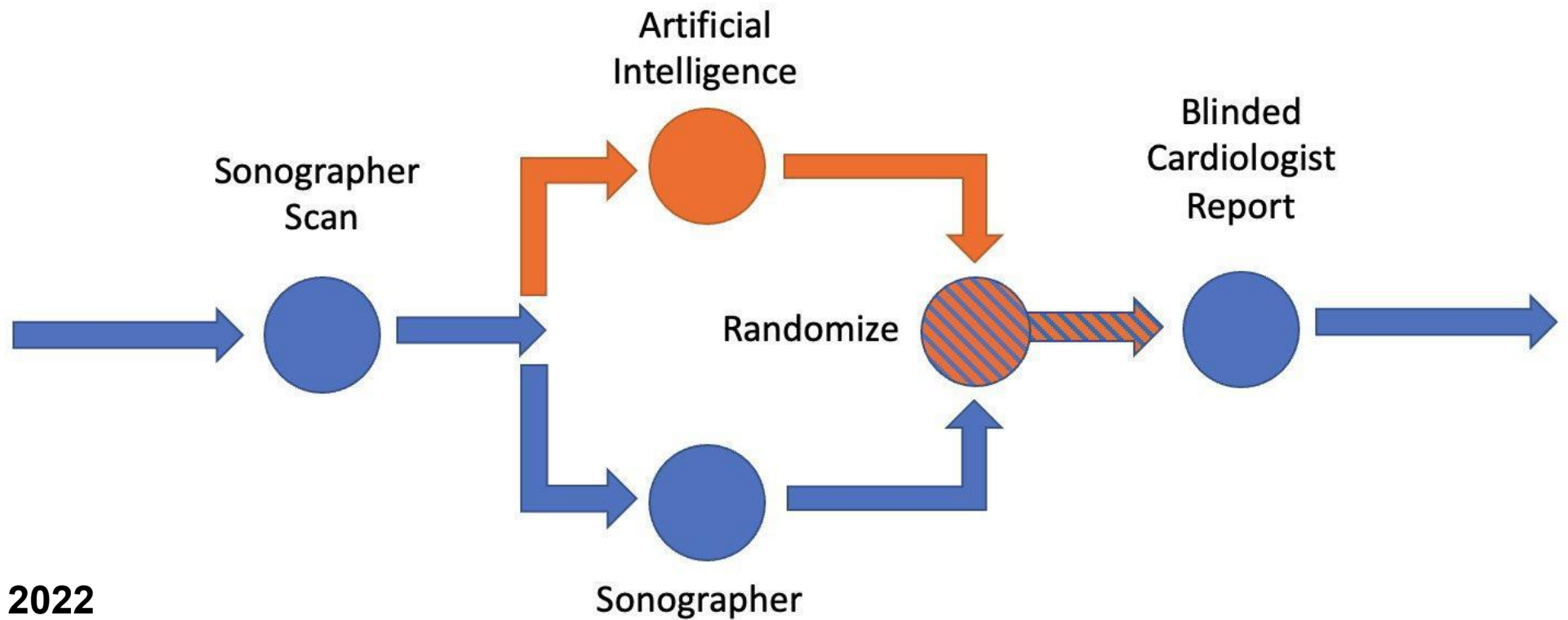


Ouyang D, et al. ESC 2022

Standard Workflow



Randomized Clinical Trial Set-up



Trial Results (Ouyang D et al. ESC 2022; n=3495)

Outcome	AI (n = 1740)	Sonographer (n = 1755)	Mean Difference (95% CI)	P value
Primary Efficacy Outcome: Initial vs. Final Assessment				
Substantial Change	292 (16.8%)	478 (27.2%)	-10.5% (-13.2% to -7.7%)	< 0.001*
Mean Absolute Difference	2.79±5.53	3.77±5.22	-0.97 (-1.31 to -0.61)	< 0.001

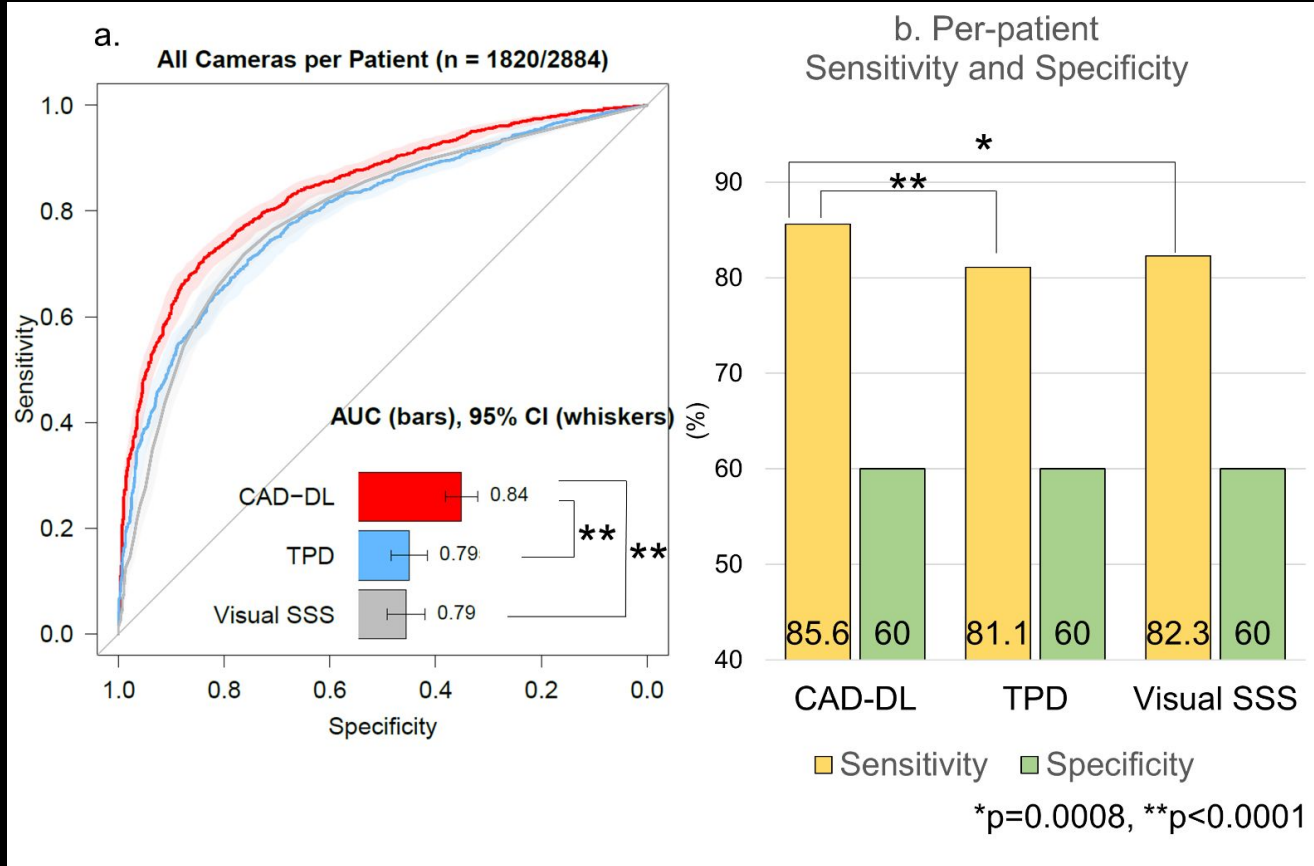
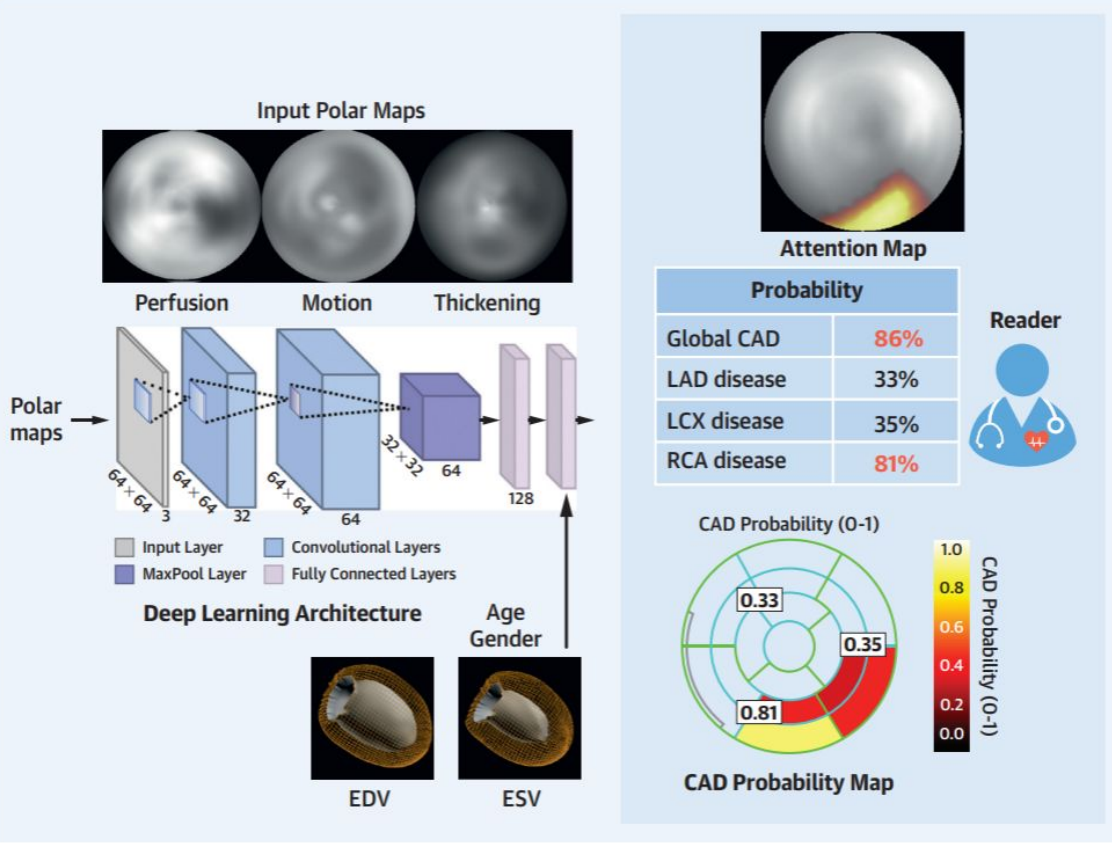
Conclusion

- For adult patients undergoing echocardiographic quantification of cardiac function, initial assessment of LVEF by AI was **noninferior** and **superior** to initial sonographer assessment.
- After blinded review of initial LVEF assessment, cardiologists **were less likely to substantially change** their final report with initial AI assessment than sonographer assessment.
- AI guided assessment took **less time** for cardiologists to overread and was more consistent with historical cardiologist assessment (**test-retest precision**).

Coronary Artery Disease

Doctor vs machine: predicting CAD from MPI

CENTRAL ILLUSTRATION Clinical Deployment of Explainable Artificial Intelligence



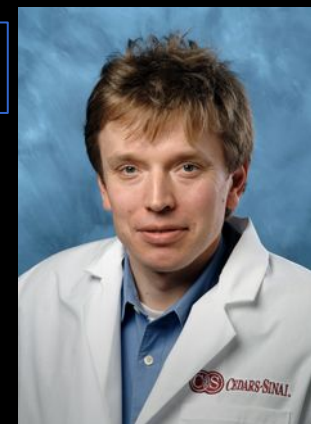
n=3578 patients, SPECT MPI + cor angio 6m
Comparison to visual scoring, multiple camera types

Explainable AI results <12s

*CAD-DL Coronary Artery Disease deep learning

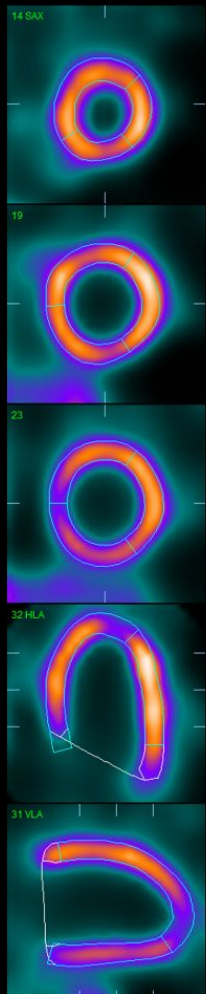
Otaki..Slomka. JACC Imaging 2022

P. Slomka



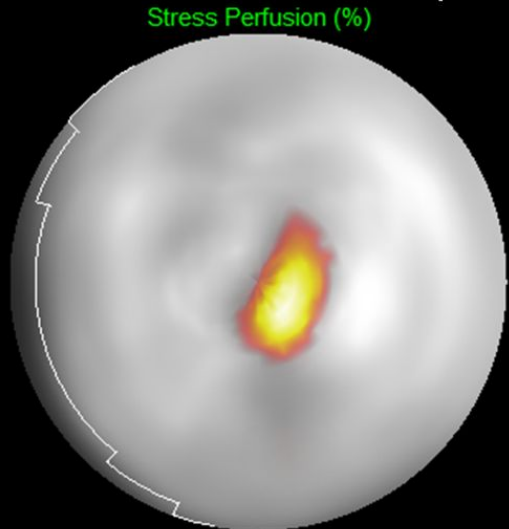
Deep learning from SPECT: case example

a. Perfusion

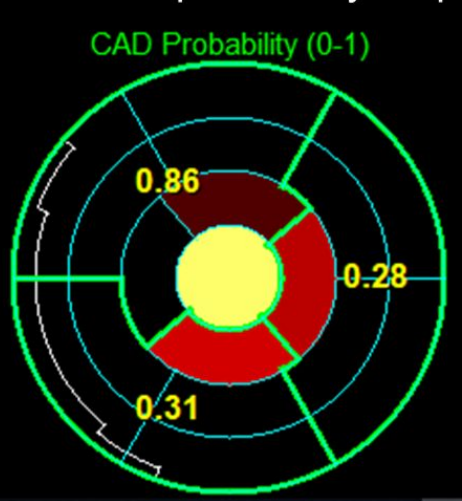


Stress TPD 4%

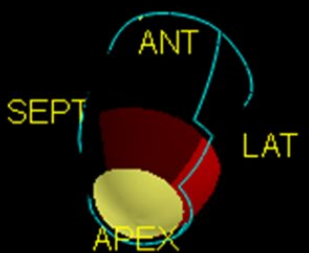
b. CAD attention map



c. CAD probability map

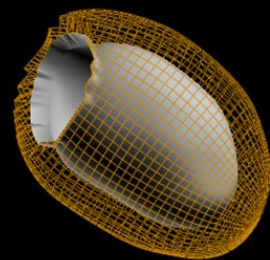


CAD Probability (0-1)

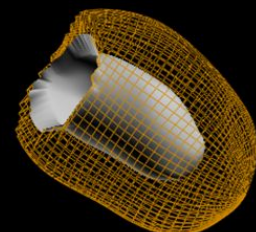


72 years old, Male

d. Gated SPECT



Stress EDV 121ml



Stress ESV 40ml

CAD probability	
Global CAD	0.88
LAD disease	0.86
LCX disease	0.28
RCA disease	0.31



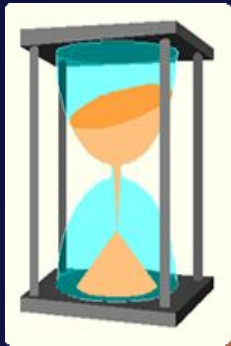
85% stenosis in the proximal left anterior descending artery (LAD) artery on coronary angiography

Processing Time: 5 sec

0 Slices (1) 100 0 Polar 100 0 Surfaces 100

Visual assessment was interpreted as normal.

Sudden Cardiac Arrest



Sudden cardiac arrest

By the time 911 is called, too late for >90%



9-1-1



• Prediction & Prevention is the Key

Chain of Survival

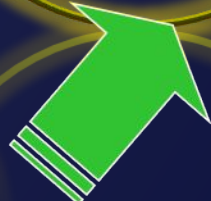
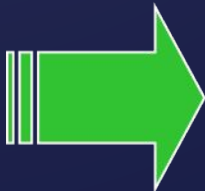
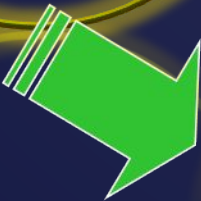
Prediction (Prevention)

Early Access

Early CPR

Early Defibrillation

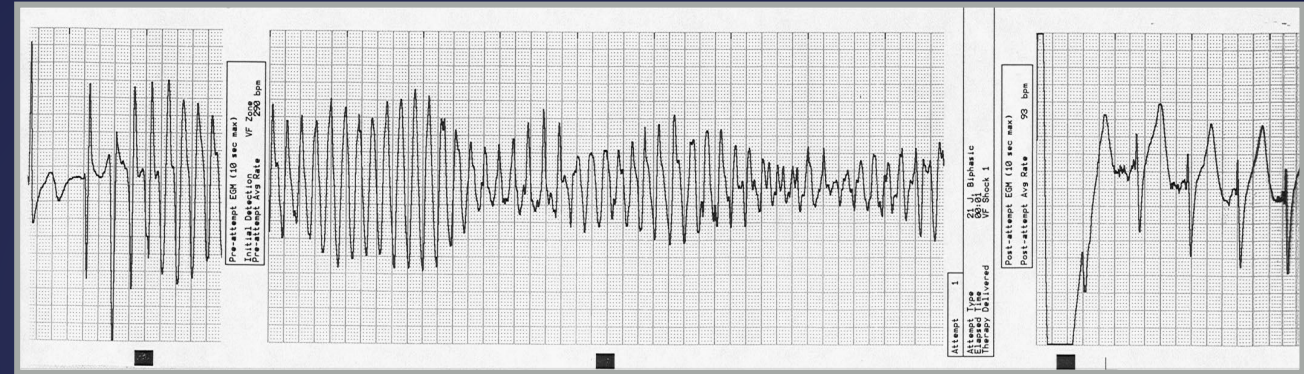
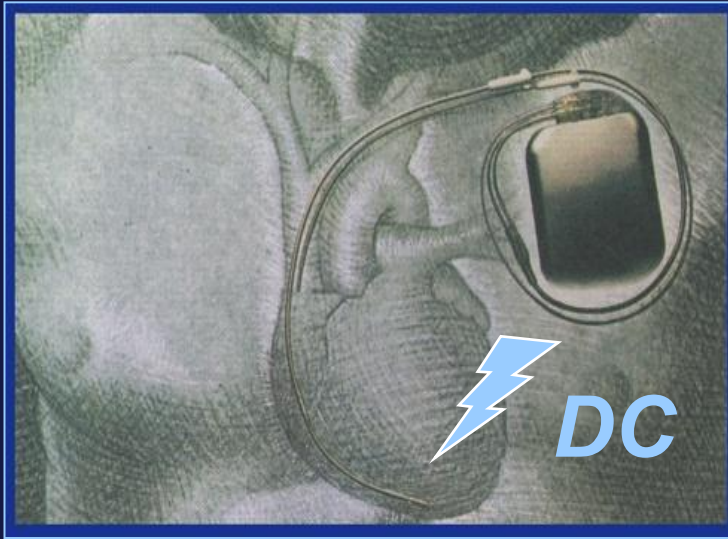
Early Advanced Care



New Research

New Treatments

Primary prevention Implantable Cardioverter-Defibrillator (ICD) Treatment of Shockable Lethal Heart Rhythms



- Main predictor of risk LV ejection fraction (imaging marker) <35%
- Yielding diminishing returns
- Among patients with ICDs, life-giving therapies in 1-3% per year (33-99 ICDs to save 1 life/yr)
- Need novel risk prediction tools

UNMET NEED: A Risk Prediction Score Beyond the Ejection Fraction

2002: Population-based Learning Health System for SCA



Integration of
PRE-HOSPITAL & HOSPITAL
Clinical Data, individual level



CCAP Population Cohorts

Oregon (2002- Discovery) & Ventura (2015- Validation)

Clinical Data Repository & Biobank



≈1 million

≈850 K

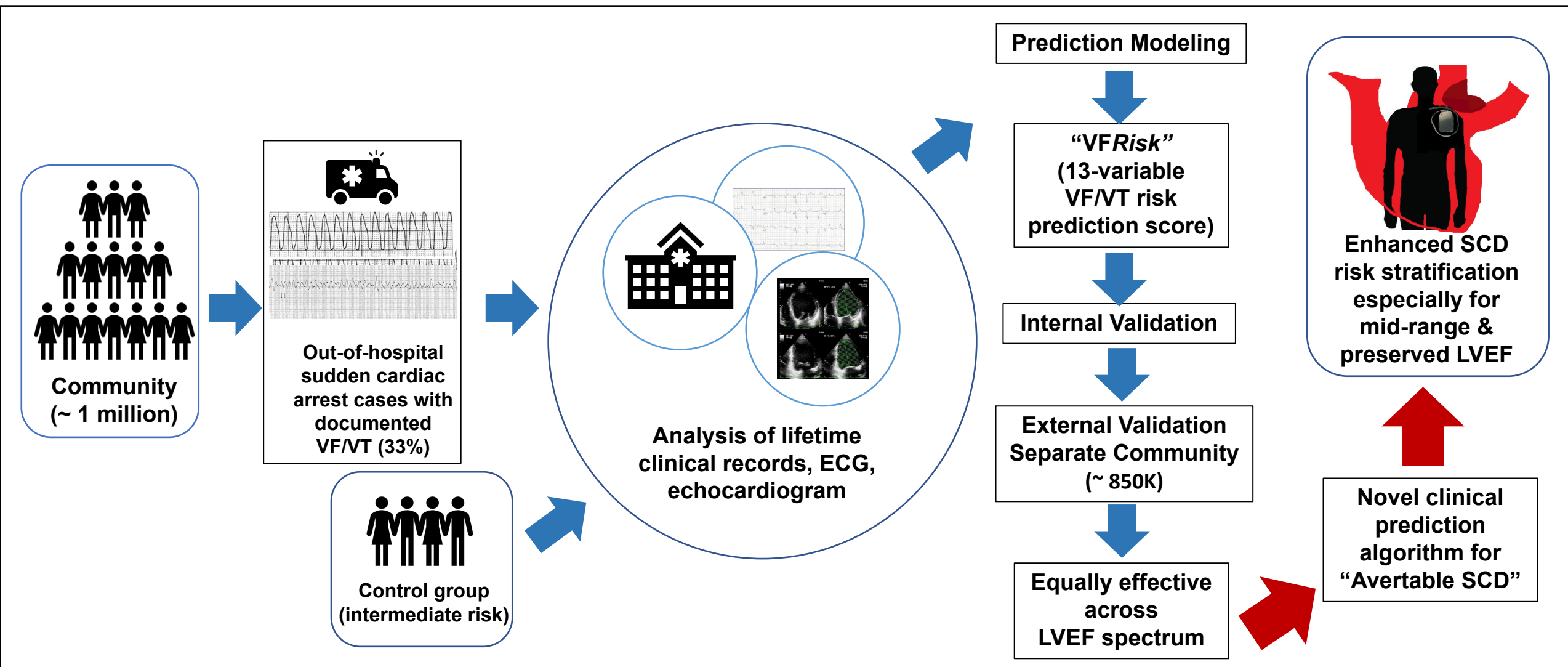


CEDARS-SINAI.
Heart Institute

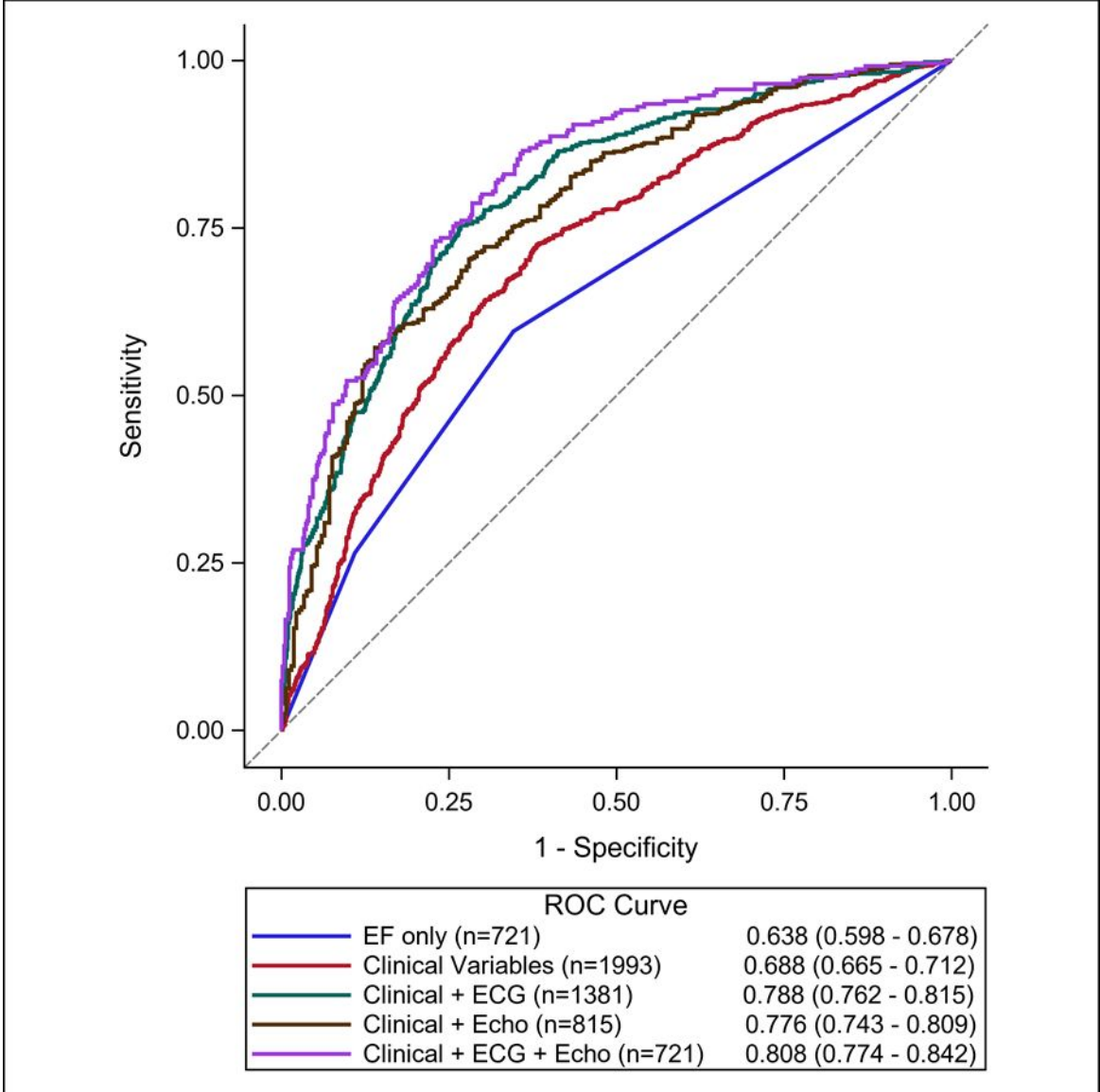
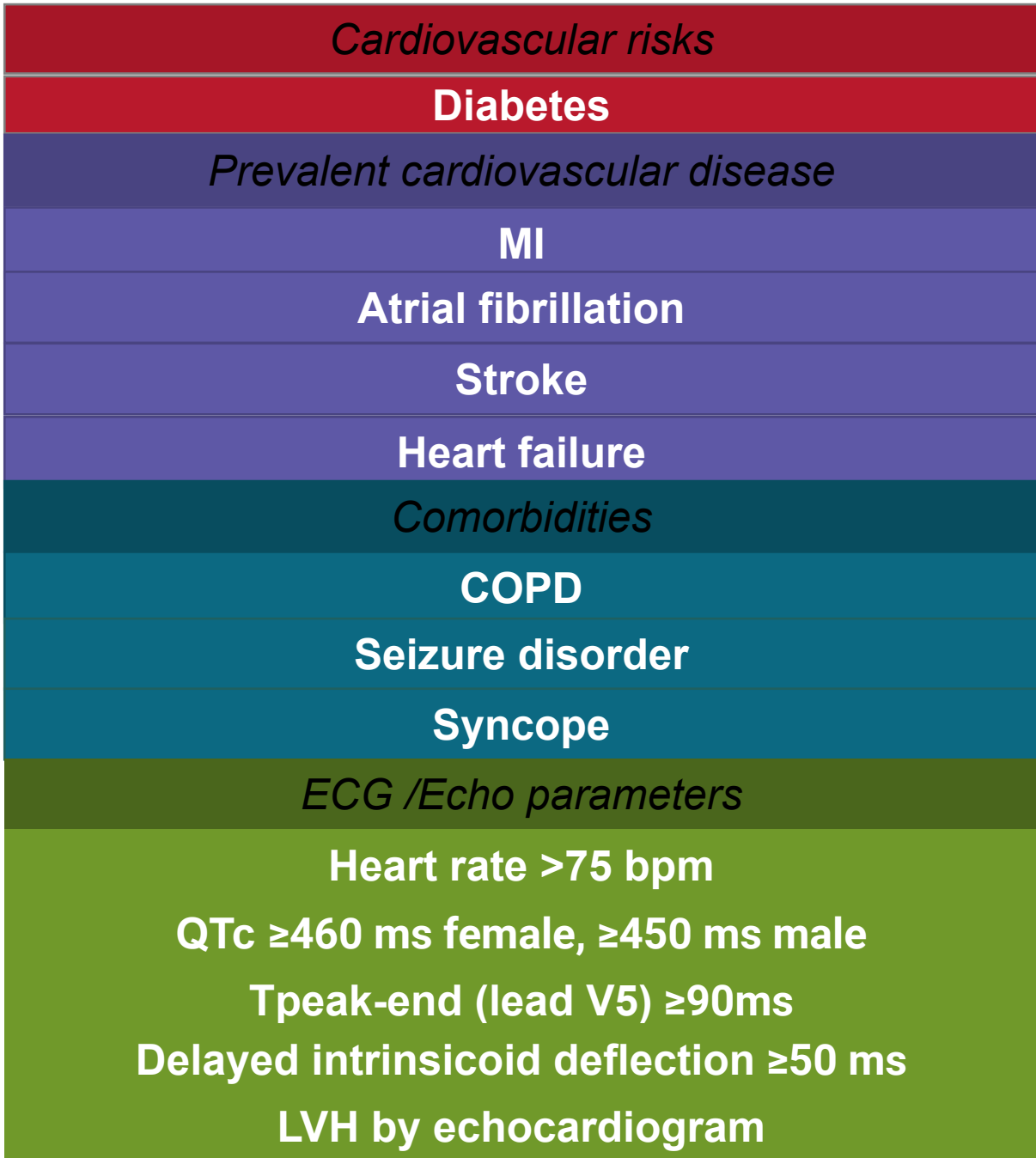


Prediction of SCD Manifesting with Shockable Rhythm

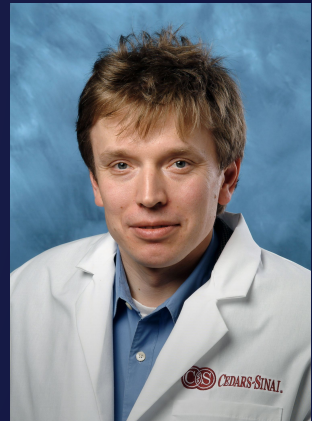
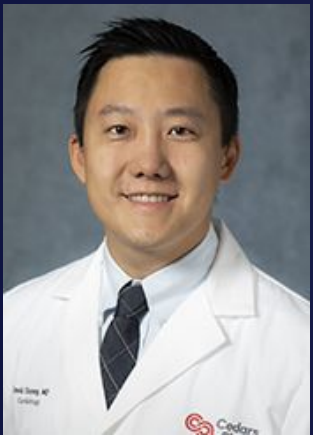
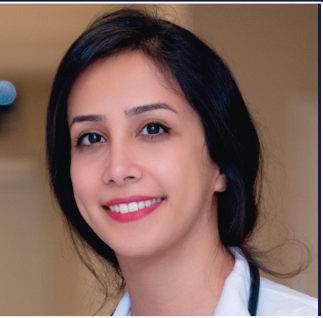
VFRisk (VF 93%/Pulseless VT 7%)



VFRisk: Clinical Risk Prediction Tool for Avertable SCD (VF/pulseless VT)



Refining Prediction of Avertable SCD



CCAP Pheno-mapping Project

Multi-modality Ai: Machine learning/Deep Learning

- Image analysis (ECG, Echo)
- Whole genome sequencing
- Phenotype-omics analysis



O.S.C.A.R. (Observational Study of Cardiac ARrest)

- 400,000 patients in the Cedars-Sinai Clinical Data Warehouse
- 10 year f/u (2016- 2025)
- Assessment of VFrisk in an intermediate risk population
- Using NLP, ML/DL (multi-modality Ai)
- Springboard to clinical trials in the field

