

Artificial Intelligence in Echocardiography

ESC-2023

Marina Leitman, MD



DASE-AI

Detect Aortic Stenosis by Echo with Artificial Intelligence



**Professor Geoffrey
Strange**

The University of Notre
Dame, Sydney (Australia)

Controversies in Aortic Stenosis

Sex differences in aortic stenosis: from pathophysiology to treatment

Sahrai Saeed, Marc R Dweck & John Chambers

Poor Long-Term Survival in Patients With Moderate Aortic Stenosis

Geoff Strange, PhD,^a Simon Stewart, PhD,^b David Celermajer, MD, PhD,^c David Prior, MBBS, PhD,^d Gregory M. Scalia, MBBS (Hons), MMedSc,^e Thomas Marwick, MBBS, PhD,^f Marcus Ilton, MD,^g Majo Joseph, MBBS,^h Jim Codde, PhD,ⁱ David Playford, MBBS, PhD,^a on behalf of the National Echocardiography Database of Australia contributing sites

Comorbidities and Symptom Status in Moderate and Severe Aortic Stenosis

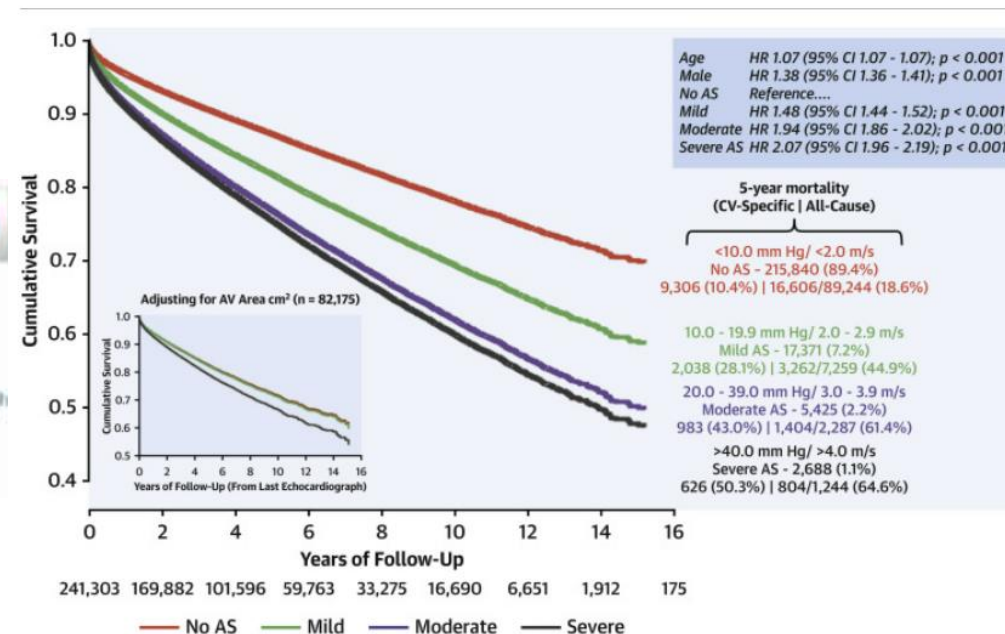
A Multicenter Clinical Cohort Study

David Playford, MBBS, PhD,^{a,b} Nisha Schwarz, PhD,^a Enayet Chowdhury, PhD,^a MyNgan Duong, PhD,^a Leighton Kearney, MBBS, PhD,^{a,c} Simon Stewart, PhD,^b

openheart

Enhanced detection of severe aortic stenosis via artificial intelligence: a clinical cohort study

Geoff Strange ,^{1,2} Simon Stewart ,^{3,4} Andrew Watts ,⁵ David Playford ⁶



9189 individuals investigated with transthoracic echo
5132 men (60.8±17.5 years) & 4057 women (61.6±18.1 years)

ROUTINE ECHOCARDIOGRAPHIC REPORTING

**SEVERE AS REPORTED IN
218/9189 CASES (2.4%)**

Body Surface Area (BSA)
1.93±0.28 m²
Peak AV Velocity (Vmax)
1.54±0.67 m/s
Left ventricular ejection fraction (LVEF)
56.5±11.8 %

AI-BASED RECLASSIFICATION (AI-AAS)

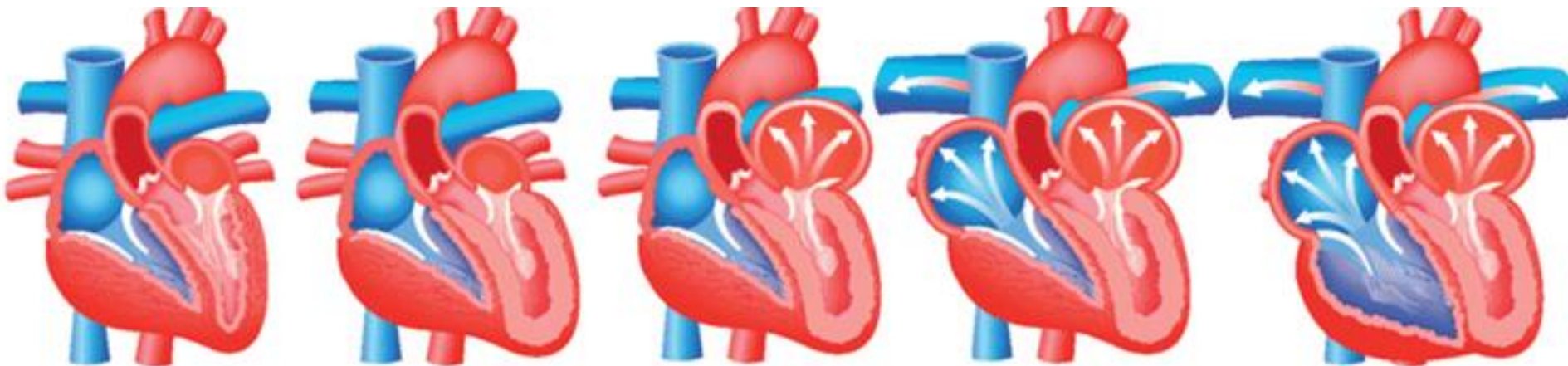
severe
patients with
AS from the
AI-DSA-
derived
phenotype, if
the peak
velocity was
≥4.0 m/s, the
mean
gradient
was ≥40mm
Hg and/or the
AVA≤1.0cm²

AI-DSA – a newly refined artificial intelligence support system

4.1% identified by the AI vs 2.4% by the human alone

72% of additional patients inside guidelines found by the AI

AI-DSA – a newly refined artificial intelligence support system



Stages/Criteria	Stage 0	Stage 1	Stage 2	Stage 3	Stage 4
	No Cardiac Damage	LV Damage	LA or Mitral Damage	Pulmonary Vasculature or Tricuspid Damage	RV Damage
Echocardiogram		Increased LV Mass Index >115 g/m ² (Male) >95 g/m ² (Female)	Indexed left atrial volume >34mL/m ²	Systolic Pulmonary hypertension ≥60 mmhg	Moderate-Severe right ventricular dysfunction
		E/e' >14	Moderate-Severe mitral regurgitation	Moderate-Severe tricuspid regurgitation	
		LV Ejection Fraction <50%	Atrial Fibrillation		

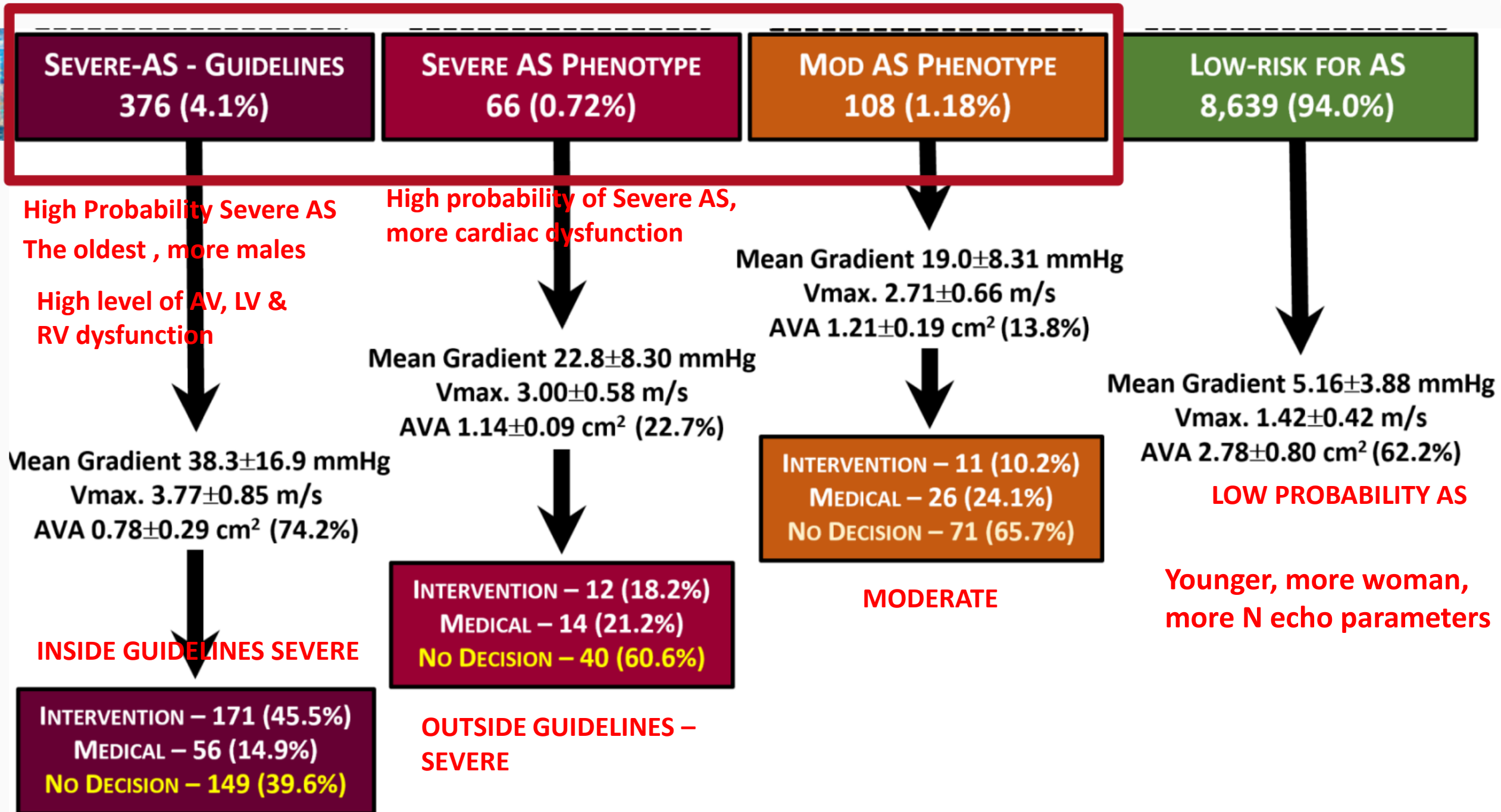
Genereux P et al. Eur Heart J. 2017

**HIGH PROBABILITY SEVERE AS
INSIDE GUIDELINES**

**HIGH PROBABILITY SEVERE AS
OUTSIDE GUIDELINES**

**HIGH PROBABILITY
MODERATE AS
INSIDE GUIDELINES**

**LOW PROBABILITY AS =LOW
RISK
MILD AS/ NO AS**



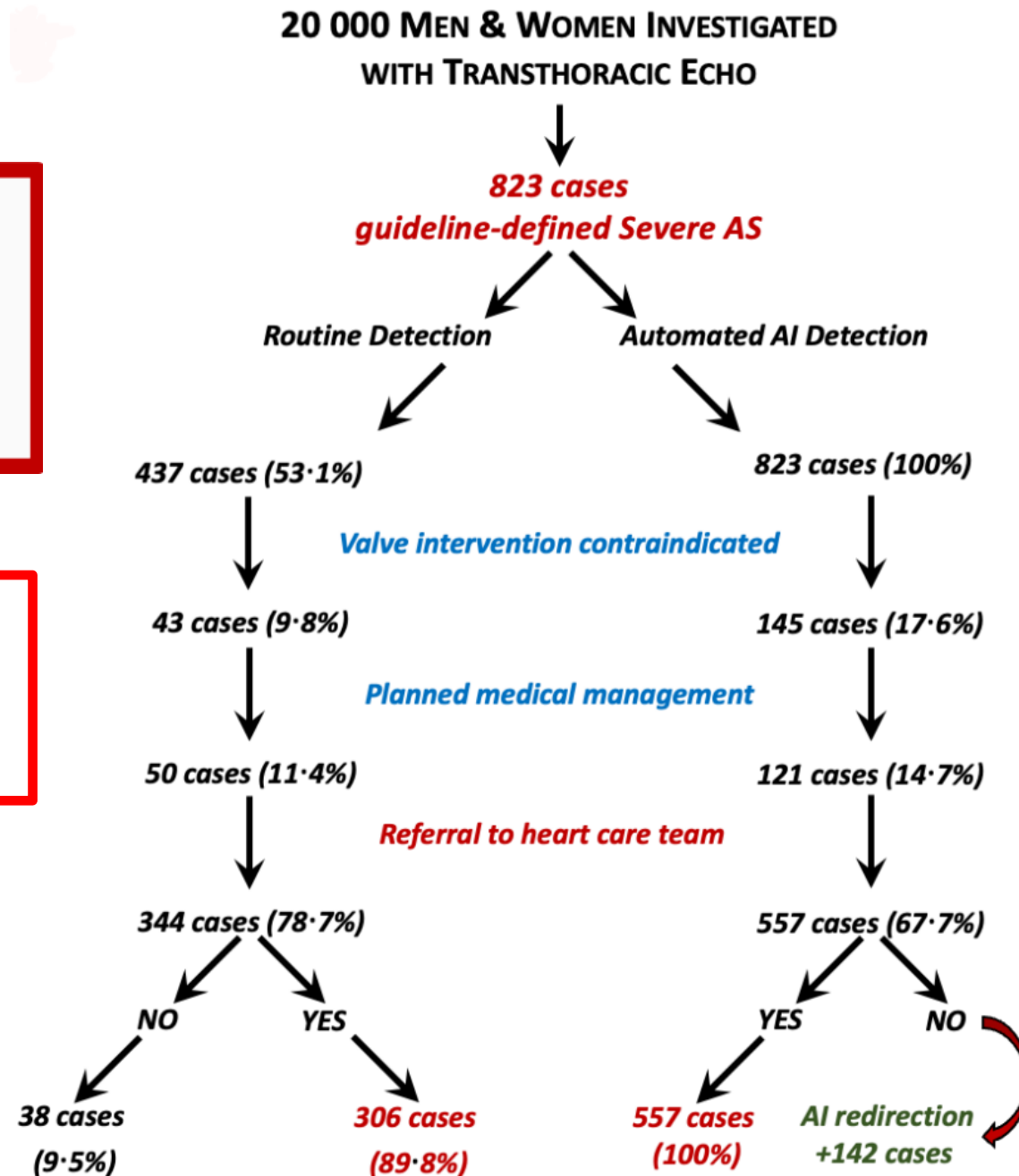
AI-Enhanced Human Diagnosis:

EchoSolv™ would redirect **2.1-fold more women** (29.8% to 62.1%) and **1.6-fold more men** (44.9% to 73.5%) towards definitive management (review +/- AVR).

Severe (**area less than 1.0 cm²**, mean gradient greater than 40 mm Hg or jet velocity greater than 4.0 m/s)

Pibarot, 2012

Bonow et al. Guidelines 2006



OPERA-AI: Artificial Intelligence Reporting of Handheld Echocardiography in Suspected Heart Failure

Dr Ross T. Campbell

School of Cardiovascular & Metabolic Health

University of Glasgow & Queen Elizabeth University Hospital, Glasgow



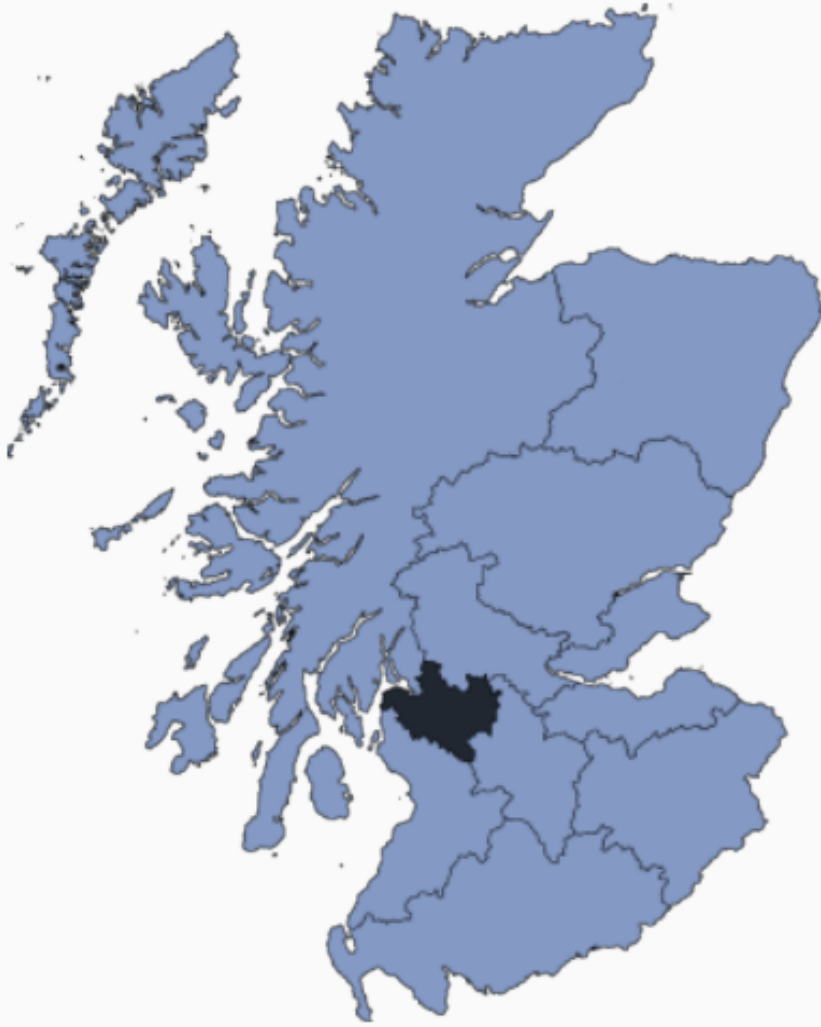
**Doctor Ross
Campbell**

University of Glasgow,
Glasgow (United Kingdom of
Great Britain & Northern
Ireland)



27/08/2023

Study setting



- **NHS Greater Glasgow & Clyde (Scotland)**
 - Population 1.2 million (~20% of national population)
- **Healthcare free at point of care**
- **Centralised HF referral pathway**
 - GP/ primary care to secondary care
 - NT-proBNP triage

Carried out during COVID 19 pandemic

NHS
SCOTLAND
**NHS Louisa
Jordan**



Study Design

Patients

- Patients attending clinical pathway for assessment of suspected HF
 - Signs/ symptoms of HF
 - Elevated NT-proBNP

Echocardiogram



Handheld
(Philips Lumify) Cart
(GE Vivid E95)

**Performed by accredited
sonographer**

Analyses

- Clinical analysis Cart
- Core lab analysis handheld + Cart
- US2.Ai analysis handheld + Cart

Methods- AI software

US2.Ai software allows automated echocardiogram analysis & reporting¹

- Identifies appropriate images & performs analysis
- Generates echocardiogram report
 - Including diagnostic parameters for HFpEF

US2.AI Report

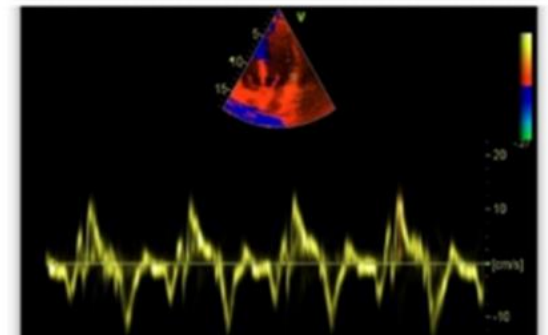


US2.AI

Main Findings

LV Systolic Function	Normal
LV Diastolic Function	Normal
RV Function	Normal
LV Geometry	Normal
LV Size	Normal
RV Size	Abnormal
RA Size	Abnormal
LA Size	Normal

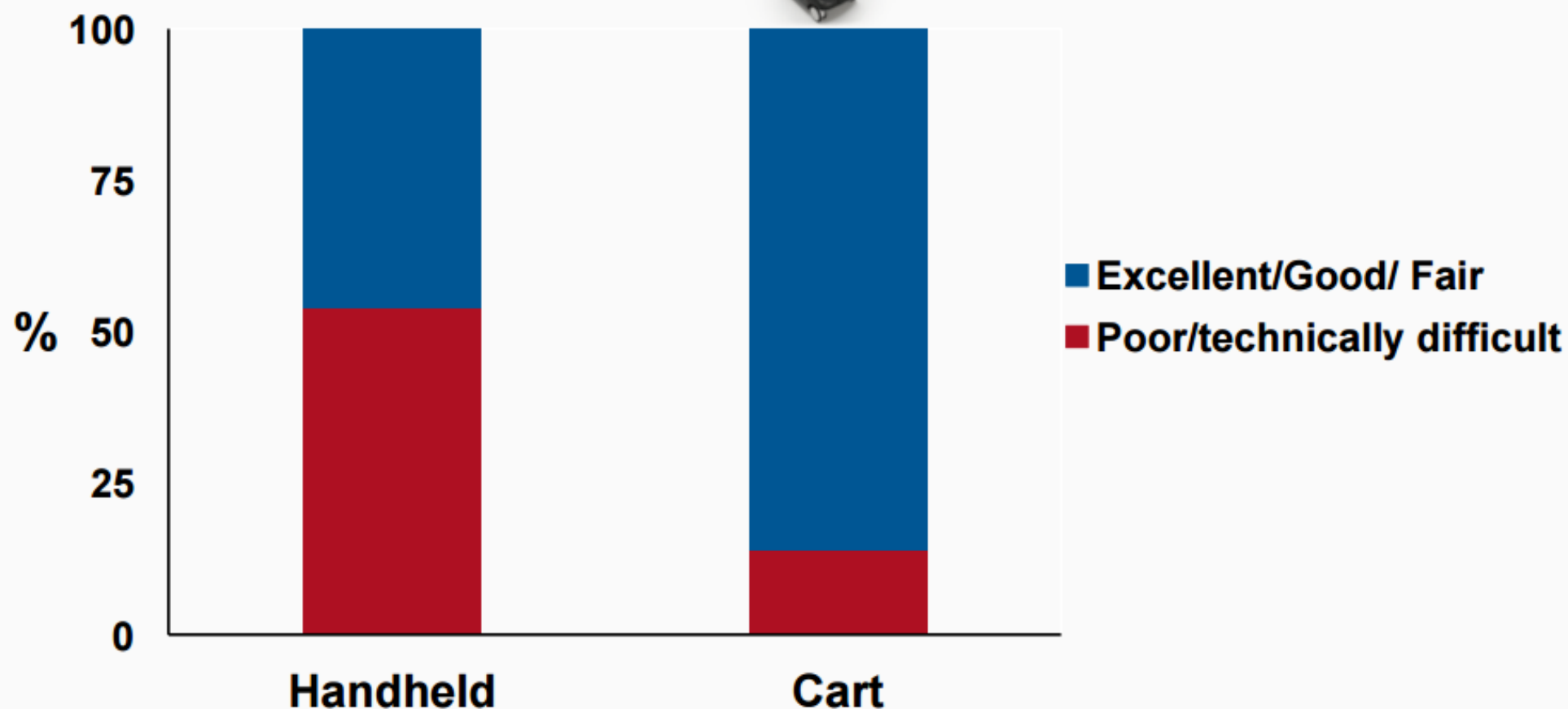
LVMi	79.1 g/m ²
RWT	0.33
MV-E	0.71 m/s
MV-A	0.52 m/s
E/A ratio	1.4
DecT	239.4 ms
e' septal	11.5 cm/s
e' lateral	13.5 cm/s
E/e' mean	5.7
s' septal	12.1 cm/s
a' septal	8.6 cm/s
s' lateral	13.0 cm/s
e' mean	12.5 cm/s
a' lateral	8.2 cm/s



1. Tromp, J. et.al., (2022) Lancet digital health, 4(1), 46-54. [https://doi.org/10.1016/S2589-7500\(21\)00235-1](https://doi.org/10.1016/S2589-7500(21)00235-1)

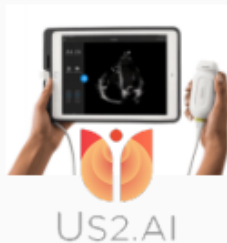
Us2.ai- current echo solutions that focus on semi-automation or black box AI or just single measurements

Image quality assessment



- **Comparison of interchangeability of LVEF (Simpson's biplane)**

US2.Ai AI algorithm
analysis of handheld

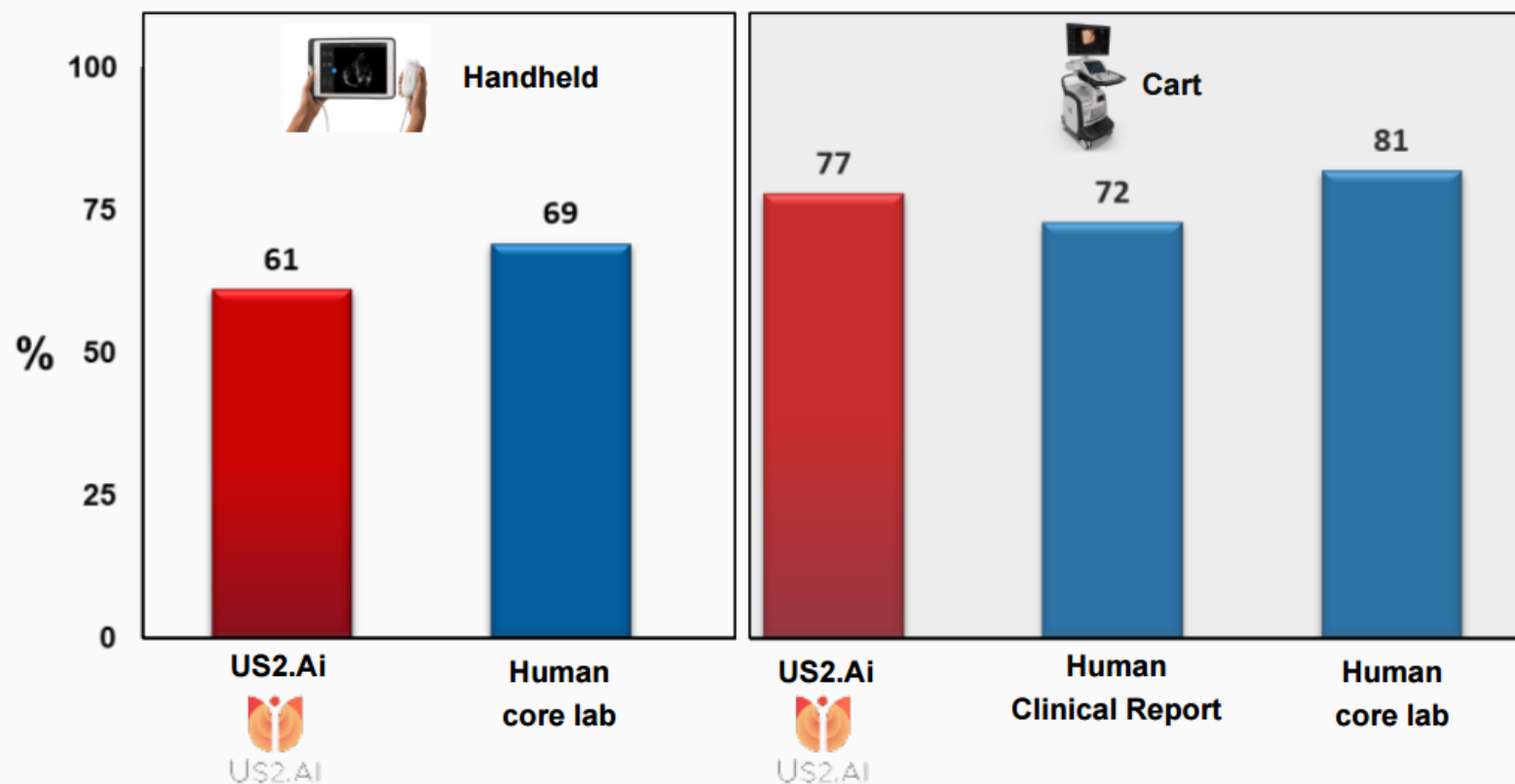


Vs



Two accredited
sonographer analysis of
cart

Percentage of scans with reportable LVEF



US2.Ai AI algorithm
analysis of handheld



Vs

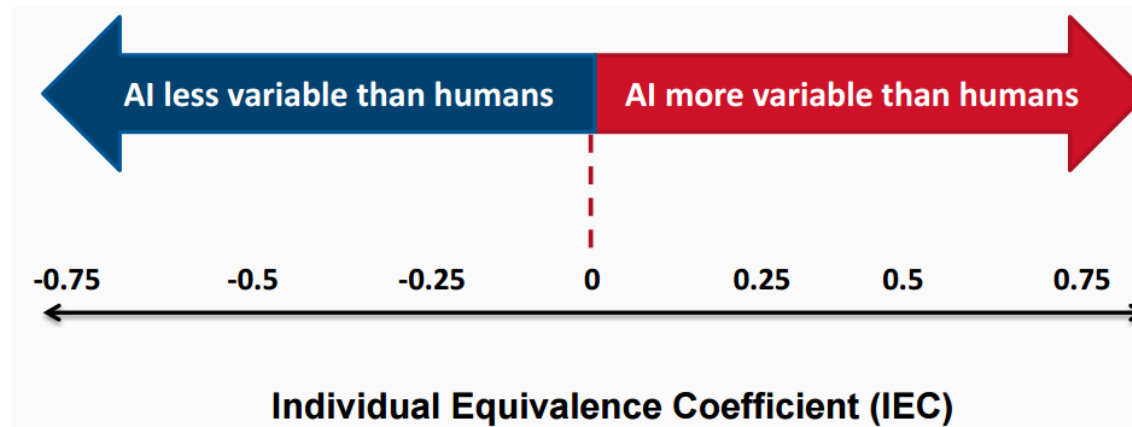
Comparison LVEF



Two accredited
sonographer analysis of
cart

Individual equivalence coefficient (95% CI) for LVEF	-0.42 (CI: -0.62, -0.19)
< 0.25 upper limit of 95% CI = interchangeable	

**US2.AI LVEF from handheld images was
interchangeable
with Cart human LVEF**





Mr Alexander Jobs

Heart Center of Leipzig,
Leipzig (Germany)

Decongestion guided by inferior vena cava ultrasound measurements in acute decompensated heart failure

On behalf of the CAVA-ADHF investigators

Alexander Jobs, MD

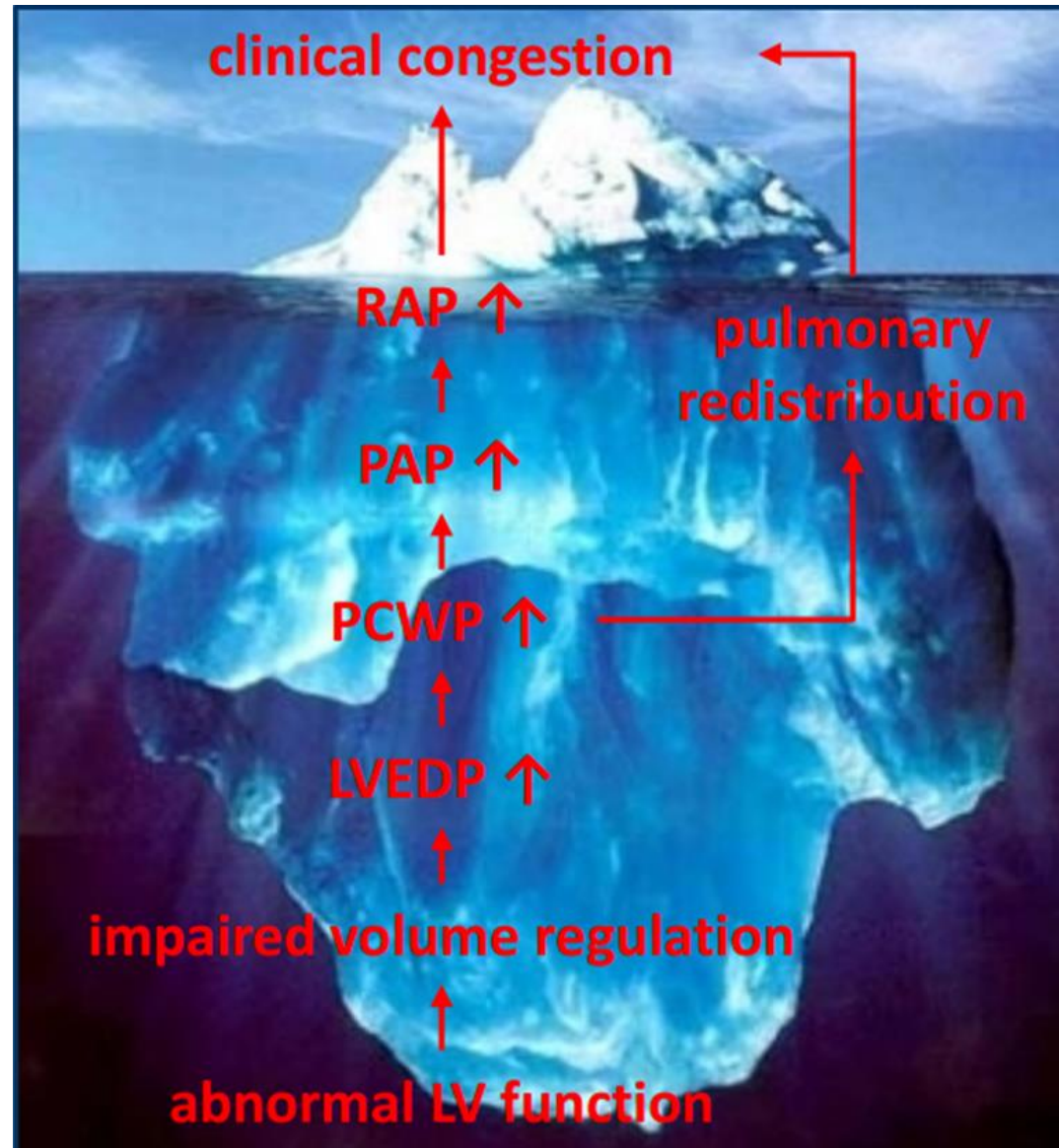
alexander.jobs@medizin.uni-leipzig.de

Heart Center Leipzig at University of Leipzig and University Heart Center Lübeck, Germany

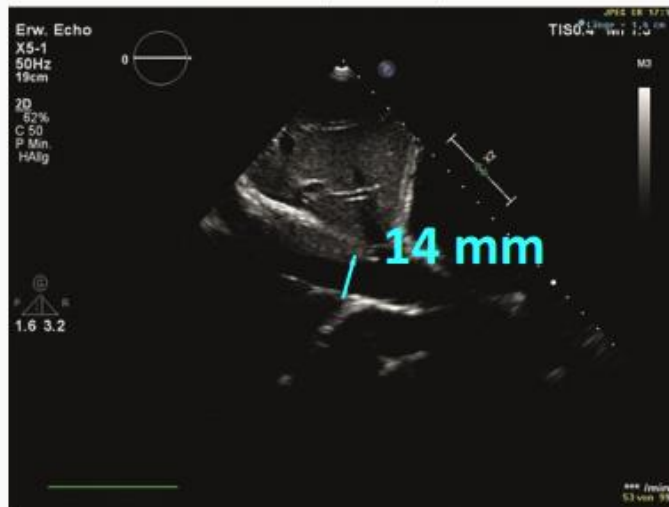
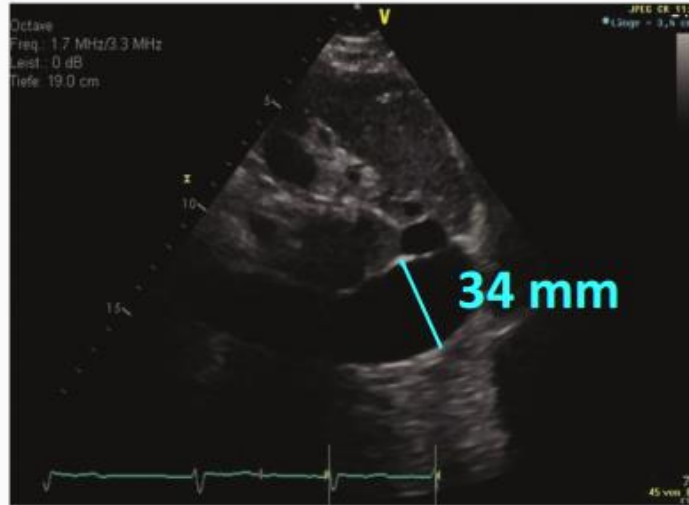
August 27th, 2023

Background: Congestion as major problem

HEART FAILURE WITH
SYSTOLIC LV DYSFUNCTION →
HIGH LVEDP → HIGH PCWP →
HIGH PAP → HIGH RAP →
RIGHT HEART FAILURE



IVC measurements as surrogate of RAP



$$IVCCI = \frac{(IVCmax - IVCmin)}{IVCmax} \times 100$$

RAP	Normal (0-5 mm Hg)	Intermediate (5-10 mm Hg)		High (10-20 mm Hg)
IVCmax	≤21 mm	≤21 mm	>21 mm	>21 mm
IVCCI	>50%	<50%	>50%	<50%

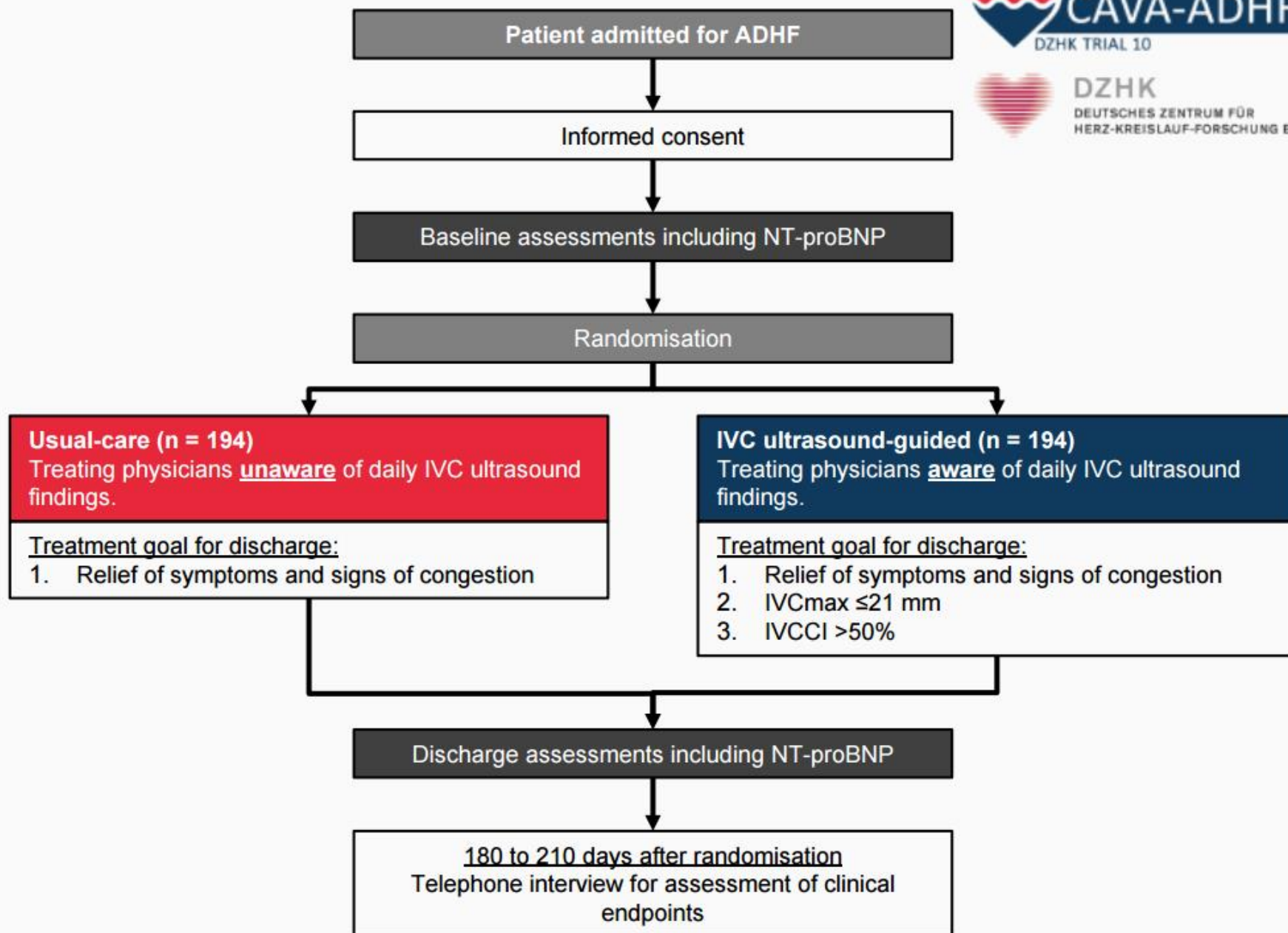
Objective of CAVA-ADHF

To determine whether decongestion guided by ultrasound assessment of IVC diameters in addition to clinical assessment leads to greater reductions in NT-proBNP levels from baseline to hospital discharge as compared with decongestion guided by clinical assessment alone.

Design



15 trial sites in Germany



Baseline Characteristics

	Usual-care (n = 192)	IVC ultrasound-guided (n = 192)
Age, years; mean (SD)	72.7 (12.4)	73.8 (11.6)
Female sex	30.4%	29.7%
NYHA functional class		
III	69.5%	71.9%
IV	30.5%	28.1%
LV-EF, %; median (IQR)	40 (25 to 54)	37.5 (27 to 51)
NT-proBNP, ng/l; median (IQR)	4,335 (2,256 to 9,060)	4,909 (2,534 to 10,141)
eGFR, ml/min/1.73m²; median (IQR)	51 (40-69)	53 (41-67)
Previous hospitalization for HF	76.9%	80.3%
Atrial fibrillation or flutter	69.3%	64.7%

Conclusion

Among patients with ADHF, the addition of IVC ultrasound to clinical assessment, in comparison to clinical assessment alone, did not improve decongestion as assessed by the change in NT-proBNP levels from baseline to discharge.

Increased Mortality Associated with Mild, Moderate and Severe Mitral Regurgitation



**Professor David
Playford**

David Playford

MBBS PhD FRACP FCSANZ FESC FACC

Professor of Cardiology, The University of Notre Dame Australia

Co-Founder and Chief Investigator, National Echo Database Australia

David Playford, Simon Stewart, Sarah Harris, Greg Scalia, David Celermajer, Liza Thomas, Kai Chan and
Geoff Strange

On behalf of the NEDA Contributing Sites

National Echo Database Australia - Contributing Sites

Population:

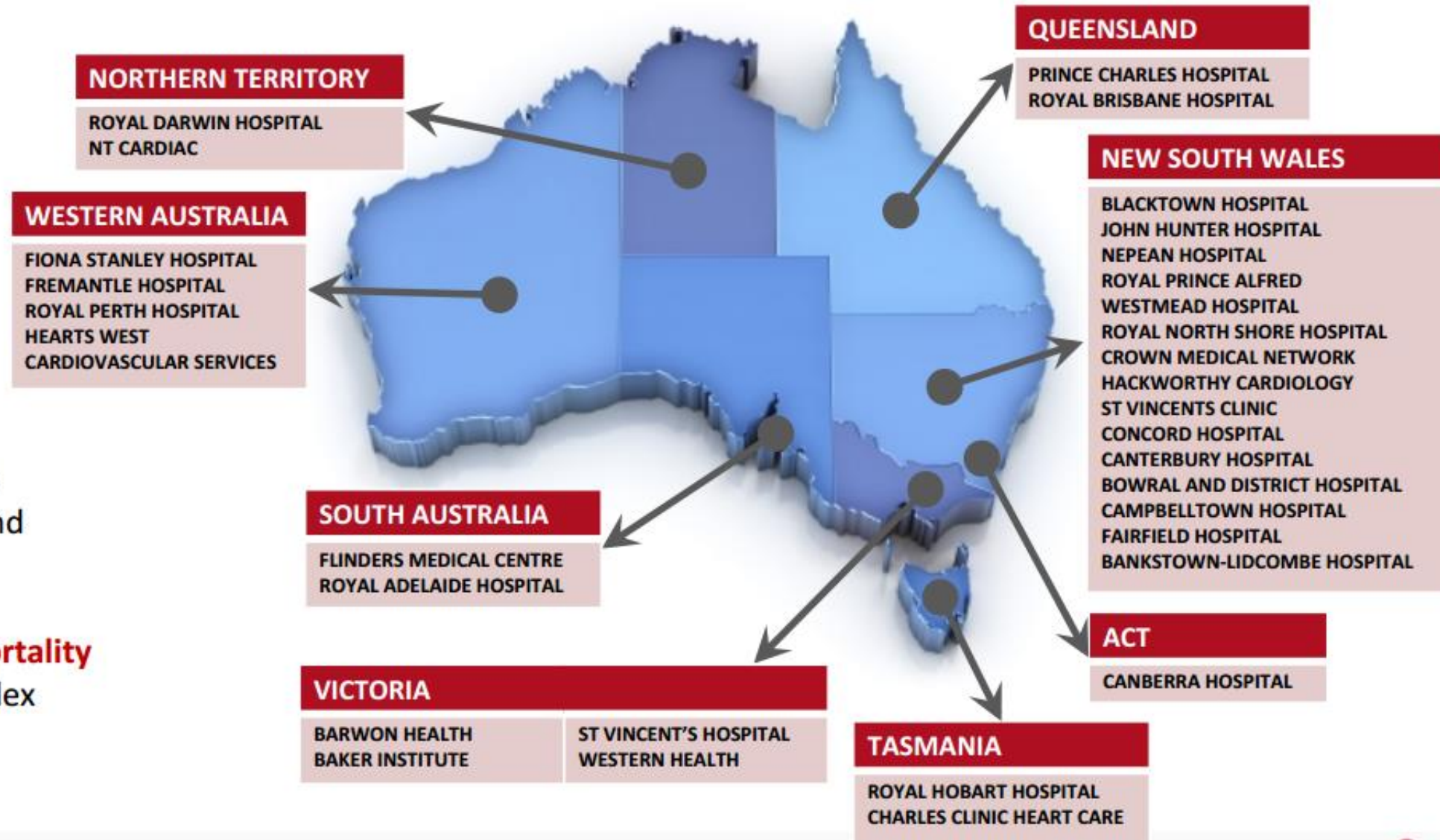
~25,000,000

Aged > 18 years:

~ 20,000,000

33 main contributing sites
representing every state and
territory of Australia

Individual linkage with mortality
via the National Deaths Index



Background and Study Objective

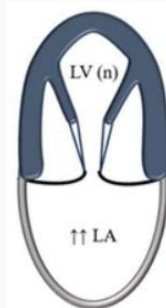
- **Background:** Prognostic implications of severe MR are well recognised, but **mortality implications of mild and moderate MR** are uncertain
- **Objective:** To determine **prognostic impact of worsening degrees of MR**, including:
 - MR due to mitral leaflet disease (MLD)
 - Atrial functional MR (aFMR)
 - Ventricular functional MR (vFMR)

MLD definition:

Any mitral leaflet **abnormality** reported, extracted using NLP

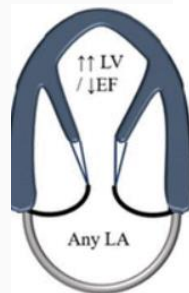
Atrial FMR definition*:

Severe LA dilatation and normal LVEF and no/mild LV dilatation



Ventricular FMR definition*:

Moderate or severe LV dilatation and/or LVEF <50%



Study Population

- NEDA v2.0 (census 21/05/2019), last echo, excluding prior mitral valve intervention

National Echo Database of Australia (v2.0)

1,077,145 echo study reports from 631,824 men & women aged ≥ 18 years linked to mortality (1st echo to Study Census - 01/01/2000 to 26/06/2019)

Excluded sequentially from primary analyses:

- Echo studies without complete data (i.e. echo completed outside 01/01/2000 to 21/05/2019 inclusive) (n=17,786 from 10,287 individuals)
- Repeat echo studies n= 437,822 (41.3%) (Range 1-52 with 386,414 having ≤ 5 repeat investigations) – LAST ONLY
- Mitral Valve Intervention: n= 9,375

608,570 people screened for mitral valve disease/MR via Natural Language Processing between 01/01/2000 to 21/05/2019 inclusive

319,808 Men aged 61.8 ± 17.1 years & 288,762 Women aged 62.1 ± 18.5 years
153,612 all-cause deaths during median 1,541 [IQR 820 – 2,629] years follow-up

- Echo reports examined for **Mitral Leaflet Disease (MLD) and MR severity** using a Natural Language Processing (NLP) custom engine developed by Echo IQ Ltd
- Individual patient-level linkage to mortality via the **Australian National Deaths Index**

No/TRIVIAL MR
M: 243,774 (53.3%)
W: 213,215 (46.7%)
MLD: 120,047 (26.3%)

102,950
(16.9%)

MILD MR
M: 51,613 (50.1%)
W: 51,337 (49.9%)
MLD: 57,200 (55.6%)

38,504
(6.3%)

MODERATE MR
M: 18,931 (49.2%)
W: 19,573 (51.8%)
MLD: 27,721 (72.0%)

10,127
(1.7%)

SEVERE MR
M: 5,490 (54.2%)
W: 4,637 (45.8%)
MLD: 7,995 (78.9%)

No/trivial MR: 75.1%
Mild MR: 16.9%
Moderate MR: 6.3%
Severe MR: 1.7%

Characteristics of men and women with mild to severe MR

- Increasing age with worsening MR severity
- Atrial Fibrillation (AF) increasingly common with worse MR severity
- Increased ventricular dimension, LV mass, atrial volumes, pulmonary pressure and TR severity with worsening MR severity

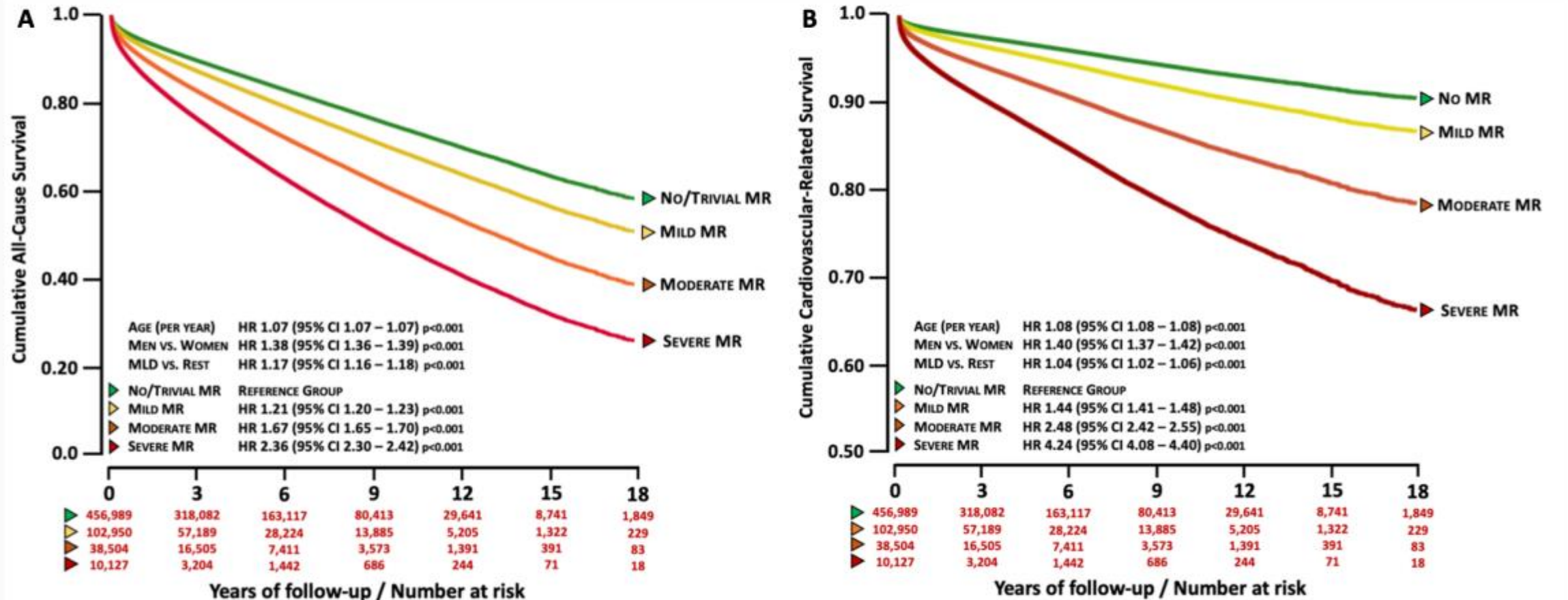
	MEN (N=319,808)				WOMEN (n=288,762)			
	No MR (n=243,774)	Mild MR (n=51,613)	Moderate MR (n=18,931)	Severe MR (n=5,490)	No MR (n=213,215)	Mild MR (n=51,337)	Moderate MR (n=19,573)	Severe MR (n=4,637)
Age at Echo, years	59.0 ± 17.0	69.5 ± 14.2	73.5 ± 13.4	72.9 ± 14.3	58.7 ± 18.3	70.3 ± 15.5	75.3 ± 14.3	75.9 ± 15.3
Atrial Fibrillation, n(%)	16,427 (6.7%)	7,551 (14.6%)	5,027 (26.6%)	1,646 (30.0%)	11,742 (5.5%)	5,093 (9.9%)	4,297 (22.0%)	1,304 (28.1%)
LVSD, cm	3.2 ± 0.7	3.4 ± 0.9	3.9 ± 1.1	4.4 ± 1.3	2.8 ± 0.6	2.8 ± 0.7	3.1 ± 0.9	3.5 ± 1.1
LVMi, g/m ²	91.9 ± 25.6	114.0 ± 34.8	122.0 ± 36.8	132.2 ± 37.3	78.5 ± 22.4	98.3 ± 33.7	105.3 ± 35.0	116.0 ± 36.8
LVEF, %	61.2 ± 11.1	58.6 ± 15.4	49.1 ± 17.4	44.0 ± 19.1	65.1 ± 9.5	64.6 ± 12.7	58.1 ± 15.4	51.8 ± 18.0
Septal e' Velocity, cm/s	8.4 ± 2.9	6.9 ± 2.4	6.6 ± 2.4	6.4 ± 2.5	8.8 ± 3.1	7.2 ± 2.7	6.7 ± 2.5	6.3 ± 2.5
LAVi, ml/m ²	33.5 ± 16.2	69.6 ± 37.5	79.8 ± 48.7	84.9 ± 54.2	31.6 ± 15.3	61.0 ± 32.5	73.51 ± 42.4	88.6 ± 55.6
Moderate-Severe TR, n(%)	4,105 (16.8%)	4,614 (19.2%)	5,134 (48.8%)	1,865 (58.0%)	5,553 (18.9%)	6,241 (23.5%)	6,199 (52.3%)	1,929 (63.6%)
Estimated RVSP, mmHg	35.2 ± 10.6	39.8 ± 11.6	43.6 ± 13.2	48.3 ± 14.9	35.0 ± 10.8	39.4 ± 11.9	43.5 ± 13.5	49.4 ± 15.4

Mitral Regurgitation Characteristics

- Mitral leaflet thickening commonly reported (~20% without MR, ~60% with severe MR)
- Mitral valve prolapse much more common with severe MR
- Mitral stenosis more common in women, particularly with severe MR
- vFMR more associated with severe MR and aFMR with mild MR

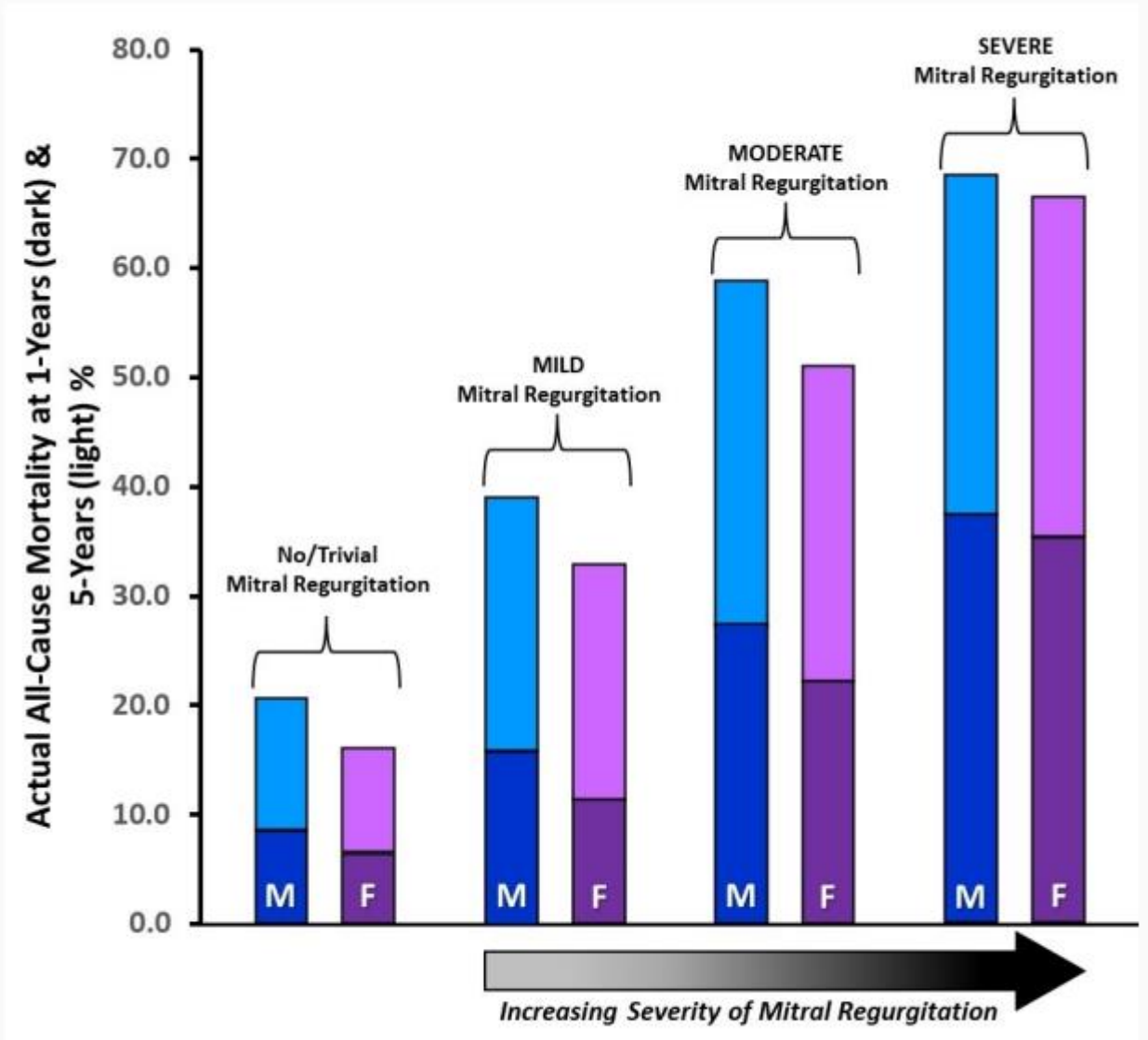
	MEN (N=319,808)				WOMEN (n=288,762)			
	No MR (n=243,774)	Mild MR (n=51,613)	Moderate MR (n=18,931)	Severe MR (n=5,490)	No MR (n=213,215)	Mild MR (n=51,337)	Moderate MR (n=19,573)	Severe MR (n=4,637)
Mitral Thickening, n(%)	44,948 (18.4%)	21,549 (41.8%)	10,344 (54.6%)	3,238 (59.0%)	42,106 (19.7%)	22,395 (43.6%)	11,109 (56.8%)	2,944 (63.5%)
Mitral Calcification, n(%)	16,289 (6.7%)	9,879 (19.1%)	4,879 (25.8%)	1,312 (23.9%)	17,890 (8.4%)	12,438 (24.2%)	6,694 (34.2%)	1,731 (37.3%)
Mitral Prolapse, n(%)	7,029 (2.9%)	1,724 (3.3%)	1,806 (9.5%)	1,236 (22.5%)	6,212 (2.9%)	2,010 (3.9%)	1,729 (8.8%)	872 (18.8%)
Mitral Endocarditis, n(%)	812 (0.3%)	295 (0.6%)	197 (1.0%)	188 (3.4%)	495 (0.2%)	261 (0.5%)	188 (1.0%)	118 (2.5%)
Mitral Stenosis*, n(%)	705 (0.3%)	272 (0.5%)	257 (1.4%)	122 (2.2%)	1,316 (0.6%)	668 (1.3%)	756 (3.9%)	329 (7.1%)
Any form of MLD, n(%)	61,558 (25.3%)	27,481 (53.2%)	13,169 (69.6%)	4,194 (76.4%)	58,489 (27.4%)	29,719 (57.9%)	14,552 (74.4%)	3,801 (82.0%)
Ventricular FMR, n(%)	4,903 (2.7%)	1,616 (6.7%)	952 (16.5%)	294 (22.7%)	3,828 (2.5%)	752 (3.5%)	455 (9.1%)	151 (18.1%)
Atrial FMR, n(%)	5,018 (2.8%)	6,676 (29.7%)	844 (17.6%)	66 (6.6%)	4,652 (3.1%)	5,921 (28.4%)	982 (21.5%)	72 (10.5%)

Adjusted long-term all-cause (A) and Cardiovascular-related (B) mortality according to MR severity



Summary

- Increasing severity of MR is associated with rising mortality
- Minor sex difference observed (**M>F**) except for severe MR
- Uncorrected **severe MR** has a poor prognosis
- **Mild and moderate MR** are also associated with mortality
- Mortality in mild and moderate MR may be due to **phenotypic cardiac changes**, further investigation is warranted



Limitations

- **Clinical information** (e.g. comorbidity, drug treatment, procedures) not captured in NEDA v2.0
- **Other external factors** may be responsible for the mortality association despite persistence with adjustment
- **No independent image-based adjudication of MR severity** – although systematic over- or under-estimation unlikely
- **Quantitation data for MR severity not readily available** despite its use for grading MR severity
- Small proportion of acute MR unlikely to affect results (and more likely to be severe)

Mortality due to rheumatic heart disease



Professor Ganesan
Karthikeyan

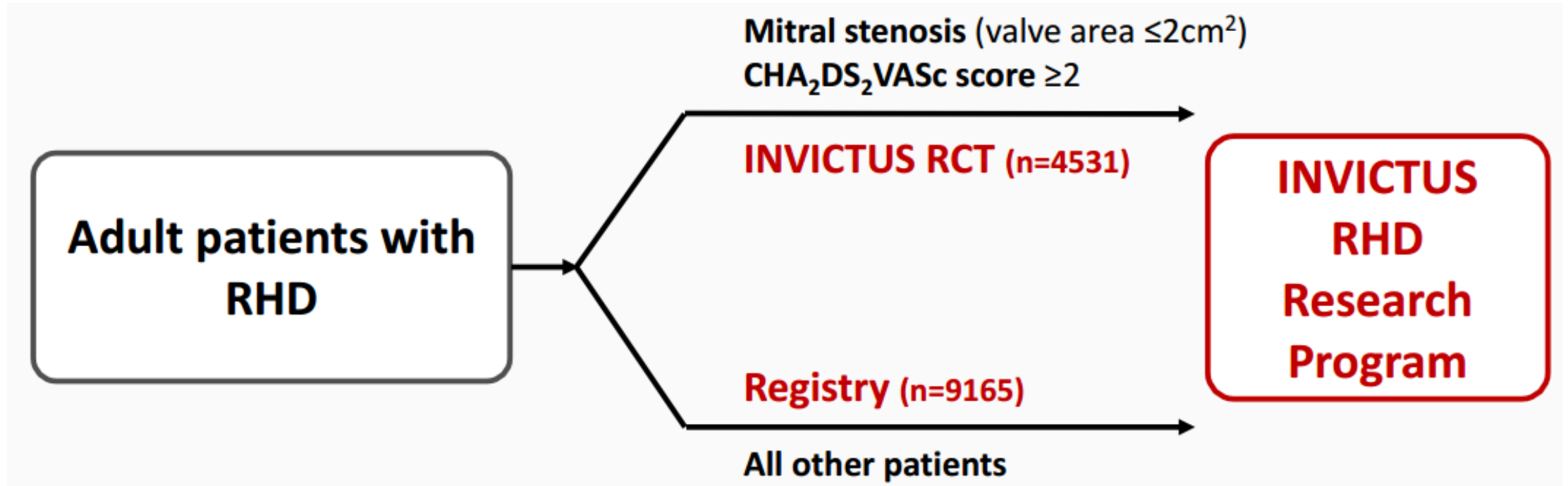
Primary results from the INVICTUS rheumatic heart disease research program from 24 countries

Ganesan Karthikeyan, Connolly S, Ntsekhe M, Rangarajan S, and Yusuf S for the INVICTUS Steering Committee and Investigators

25th August 2023

RHD affects over 40 million people, mainly in LMICs

In 2018, the WHO adopted a resolution calling for high quality data to guide policy and action



- **Primary outcome**

- All-cause mortality (vascular* and non-vascular)

*Death due to HF, sudden death, stroke

- **Secondary outcomes**

- Hospitalization for HF
- Stroke or TIA
- Infective endocarditis
- Recurrent rheumatic fever

Participating sites

- **13,696** participants over **6 years**
- 138 sites in 24 LMICs
- Africa, Asia, Middle-East, and Latin America
- **PHRI, Hamilton, Coordinating Centre**



Key differences by country income status

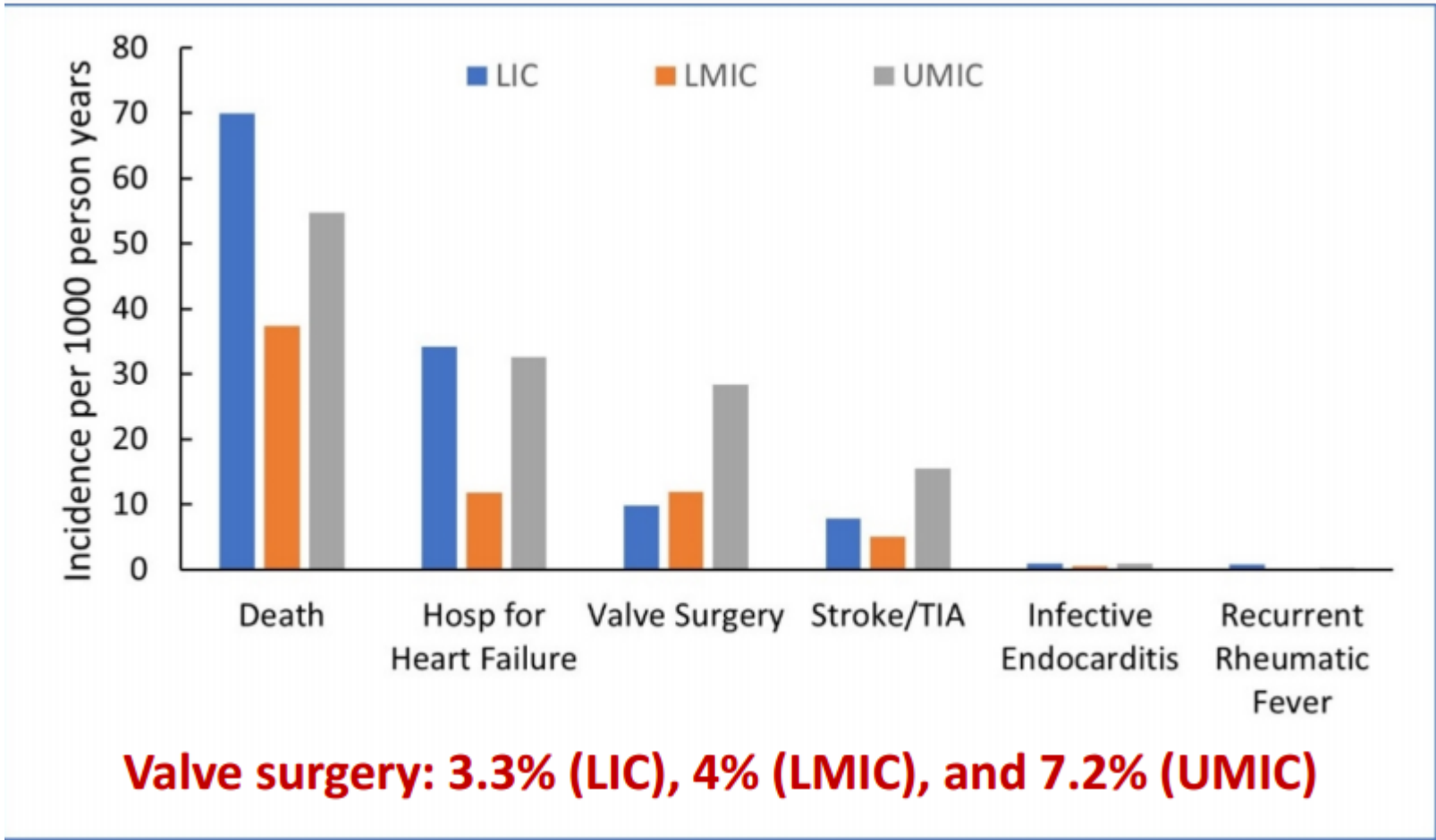
	LIC (n=2769)	LMIC (n=8453)	UMIC (n=2474)
Age, years, mean	33.1	43.9	52.3
Atrial fibrillation, n (%)	719 (26.0)	2874 (34.0)	889 (35.9)
Mitral regurgitation, n (%)	1249 (45.1)	3723 (44.0)	920 (37.2)
Aortic regurgitation, n (%)	546 (19.7)	1367 (16.2)	370(15.0)
Aortic stenosis, n (%)	29 (1.1)	206 (2.4)	96 (3.9)
Pulmonary hypertension, n (%)	1087 (39.2)	3411 (40.4)	803 (32.5)
Diuretic use, n (%)	2182 (78.8)	6626 (78.4)	1554 (62.8)
Secondary prophylaxis, n (%)	1748 (63.1)	3522 (41.7)	385 (15.6)
Prior valvuloplasty or surgery	378 (13.7)	1348 (16.0)	1124 (45.4)

p value for trend <0.0001 for all comparisons

	Overall (n=13696)	LIC (n=2769)	LMIC (n=8453)	UMIC (n=2474)
Smoking, n (%)	1299 (9.5)	103 (3.7)	587 (6.9)	609 (24.6)
Hypertension, n (%)	2490 (18.2)	222 (8.0)	1223 (14.5)	1045 (42.2)
Diabetes, n (%)	633 (4.6)	48 (1.7)	347 (4.1)	238 (9.6)
Stroke/TIA/SE, n (%)	1201 (8.8)	167 (6.0)	568 (6.7)	466 (18.8)
Coronary artery disease, n (%)	145 (1.1)	18 (0.7)	46 (0.5)	81 (3.3)

p value for trend <0.0001 for all comparisons

N=13,696, median 3.1 years (2.2, 4.0 years), 95% follow-up 14.2% patients died



Death d/t any cause 4.7% /y (1943)

HF hospitalization 2.0%/ y (805)

Cardiovascular death 3.2%/y (1312)

- Heart failure 1.6%/y (667)

- Sudden death 0.9%/y (352)

- Stroke 0.2%/y(79)

Predictors of mortality

	HR (95% CI)	p value
Age (10-year increase)	1.07 (1.03-1.11)	<0.0001
Congestive heart failure	1.68 (1.50, 1.87)	<0.0001
Pulmonary hypertension	1.52 (1.37, 1.69)	<0.0001
Atrial fibrillation	1.30 (1.15, 1.46)	<0.0001
Left ventricular dysfunction	1.18 (1.05, 1.32)	0.0049
Smoking	1.20 (1.03, 1.39)	0.0179
Diabetes	1.56 (1.30, 1.87)	<0.0001
Prior stroke/TIA	1.24 (1.08, 1.42)	0.0022
Coronary artery disease	1.57 (1.14, 2.18)	0.0059
Higher country income group		
- UMIC vs. LIC	0.57 (0.34, 0.94)	0.0287
- LMIC vs. LIC	0.49 (0.31, 0.76)	0.0016
Secondary antibiotic prophylaxis*	0.71 (0.59, 0.85)	0.0002

LIC

UMIC

Conclusions and implications

- Mortality in RHD is mainly due to **heart failure**
- May be due to **lower utilization of valve surgery and valvuloplasty** and limited access to **hospitalization** for HF

.

The greatest reduction in morbidity and mortality may be achieved by

1. Increasing the availability and access to timely **valve interventions and surgery**, and
2. Improving access and outcomes of **hospital care** for HF

THANK YOU FOR YOUR ATTENTION

