

# Human vs AI-Based Echocardiography Analysis as Predictor of mortality in Acute COVID-19 Patients:

## WASE-COVID Study

**Federico M Asch, MD, FASE, FACC**

Director, CV Core labs and Cardiac Imaging Research

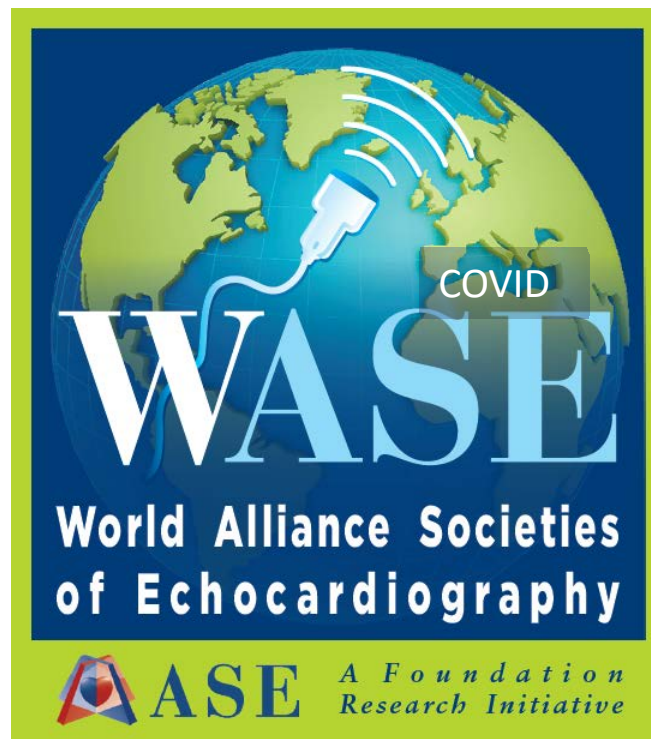
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**Federico Asch MD FASE, PI**  
**Roberto Lang MD FASE, PI**

American Society of Echocardiography Foundation,  
Alliance Partners and  
Global Collaborators



**ASE** Foundation

  
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# Disclosures

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# Background

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- Transthoracic echocardiography (TTE) has emerged as the leading cardiac imaging modality for patients admitted with COVID-19 infection
- Myocardial injury has been linked with poor outcomes, therefore an echocardiogram at admission may prove to be a powerful tool to predict death.
- The role of AI in cardiovascular imaging and specifically echocardiography is expanding, to facilitate image acquisition and analysis
- With reader-dependent technologies such as echocardiography, fully automated, AI-based analysis should result in lower variability of results than those obtained from human reads.
- With increased interpretation consistency, it is foreseeable that the use of automated measurements could improve the capacity to predict outcomes.

# Aims

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- 1- To explore association of echo variables with in-hospital mortality (Phase 1)
- 2- To describe the performance of machine learning -derived algorithms for prediction of death in patients admitted for acute COVID-19 infection and its incremental value to that of expert echocardiographer analysis (Phase 2)

# WASE-COVID study Design

Observational, International

## Phase 1- Retrospective Enrollment:

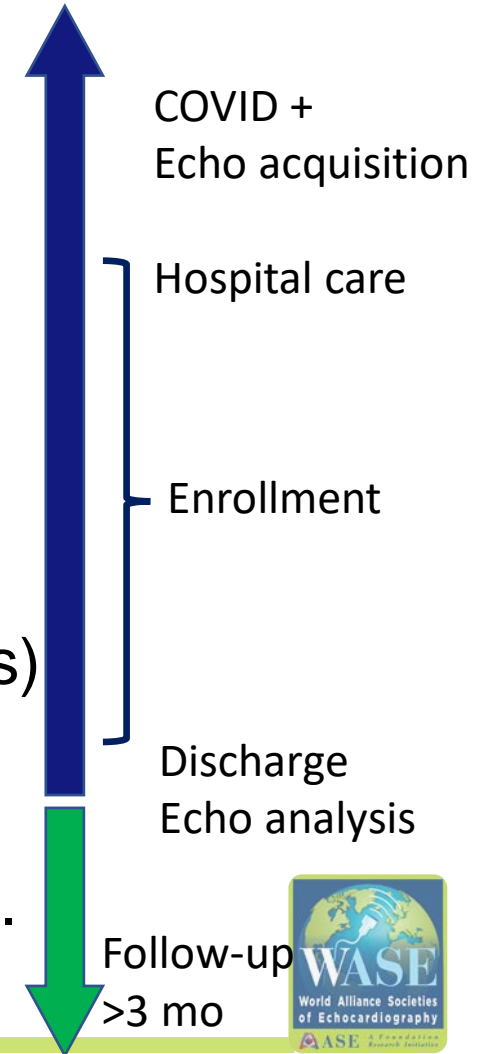
Adults Hospitalized for COVID-19 infection  
(+) specific PCR or Antigen  
Clinically-indicated echo

Echocardiogram:

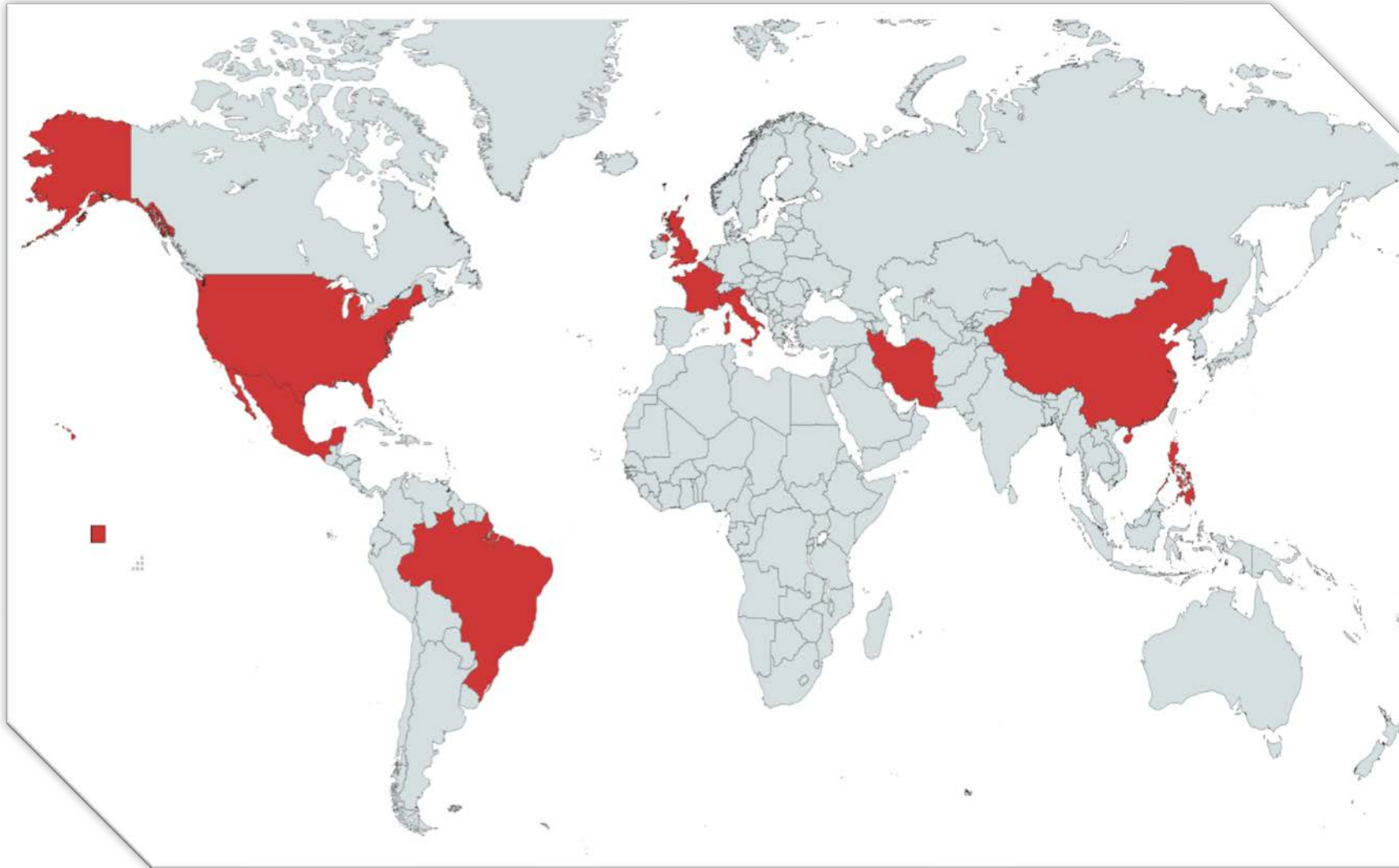
Acquisition by center standards  
Central, independent analysis (ASE Guidelines)

Phase 2- Prospective Follow-up > 3 months,  
Medical encounter, med records, or phone call.

**Outcome: All-cause mortality**



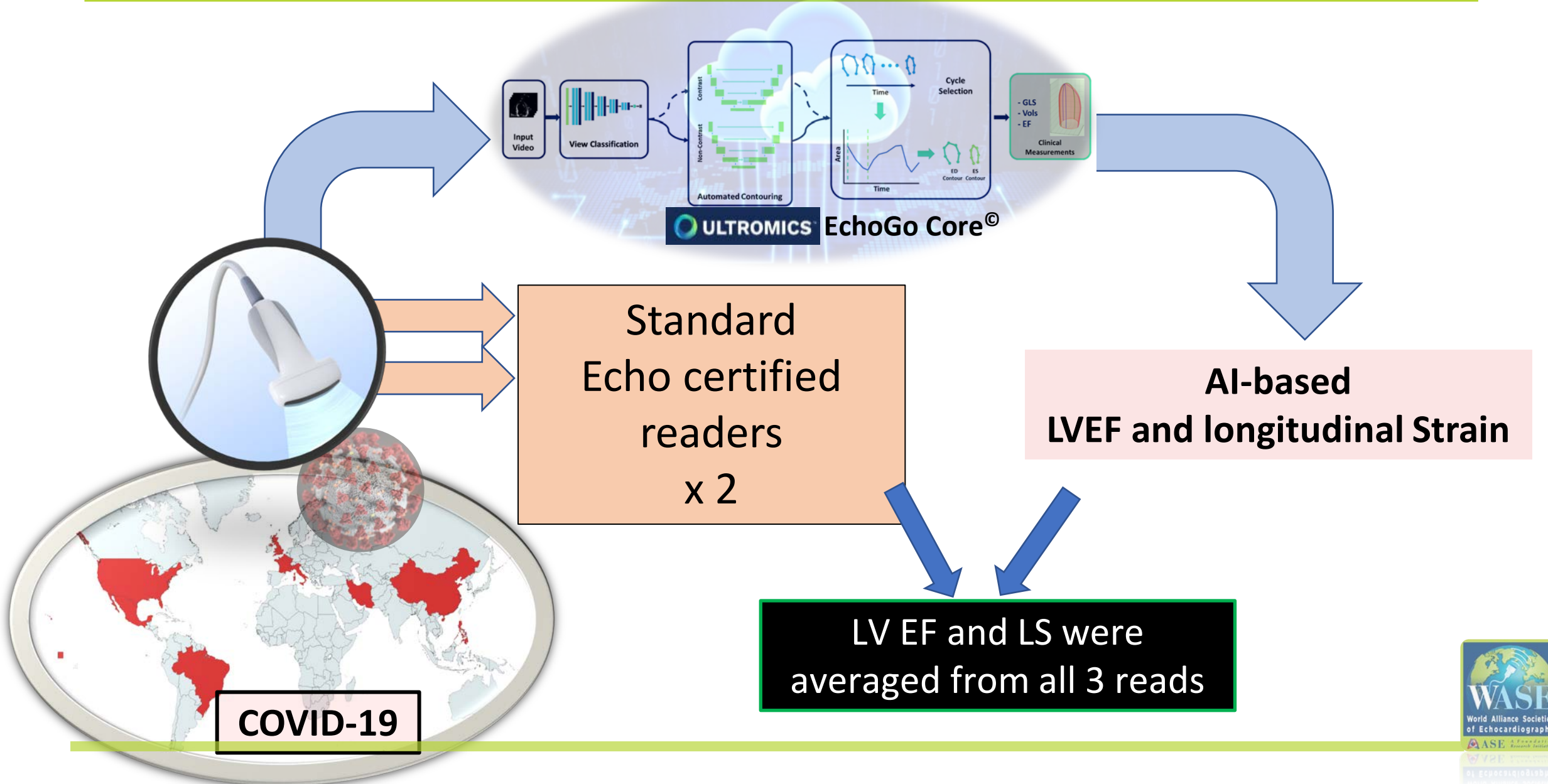
# n=870, 13 centers, 9 countries



USA x2  
Mexico x2  
Brazil  
UK  
France  
Italy x2  
Iran x2  
China  
Philippines



# 2D Echo analysis - LVEF, volumes, LV LS





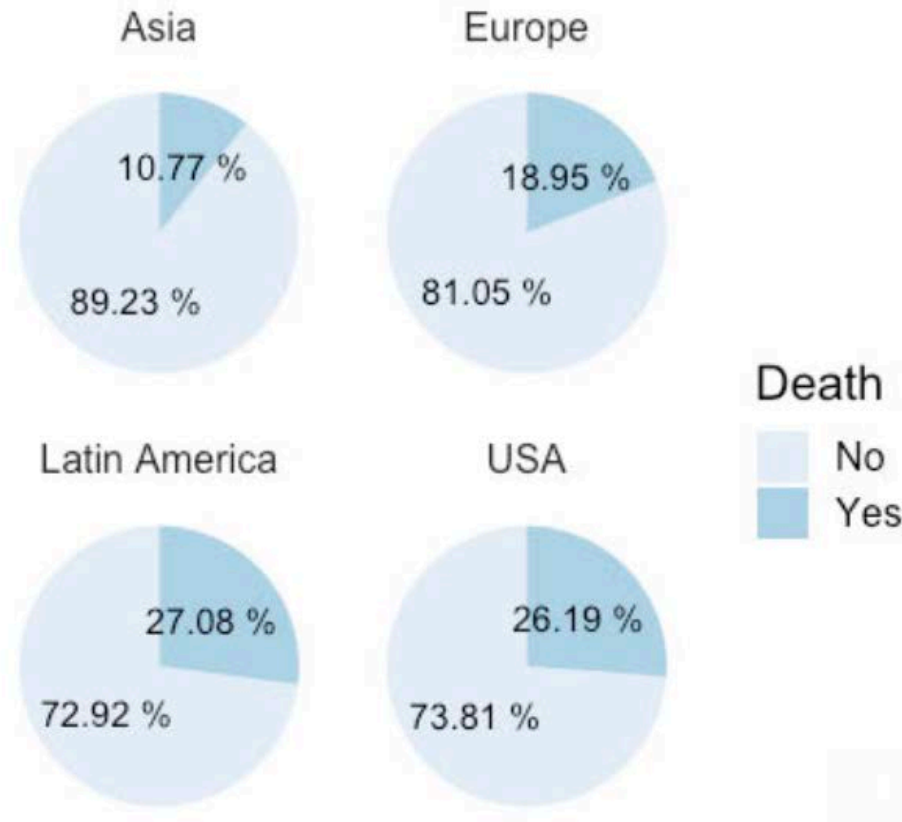
# Population n=870

Age		59 ± 15
Sex, %	Female	43.8
Ethnicity, %	White non-Hispanic	22.6
	White Hispanic	17.5
	Black	15.6
	Asian	31.1
	Mixed	8.3
	Other	3.9
	Unknown	0.9
Blood pressure, mmHg	SBP	123 ± 19
	DBP	75 ± 12
Heart rate, BPM		85 ± 15
Status at initial TTE, %	ICU	46.2
	Mechanical Ventilation	27.1
	Hemodynamic support	17.8
Previous conditions, %	Heart disease	62.5
	Lung disease	14.6
	Kidney disease	9.2
	Hypoxemia	2.8

# Echo characteristics

Characteristic	All
<b>Left Ventricle</b> (AI/human)	(n=722 )
LV EF, %	60.2 ( $\pm$ 12.3)
LVEDV, ml	107.9 (45.1)
LVESV, ml	44.8 ( $\pm$ 33.7)
LVLS, %	-18.7 ( $\pm$ 5.3)
<b>Right Ventricle</b> (no AI)	(n=509 )
RV FW strain, %	-22.8 ( $\pm$ 6.1)
RV basal dimension, cm	4 ( $\pm$ 2.5)
Pericardial effusion, (n, %)	145 (19.4%)

# In-Hospital all cause mortality: 188 (21.6%)



# LV LS was associated with in-hospital death, LVEF was not (forward stepwise linear regression)

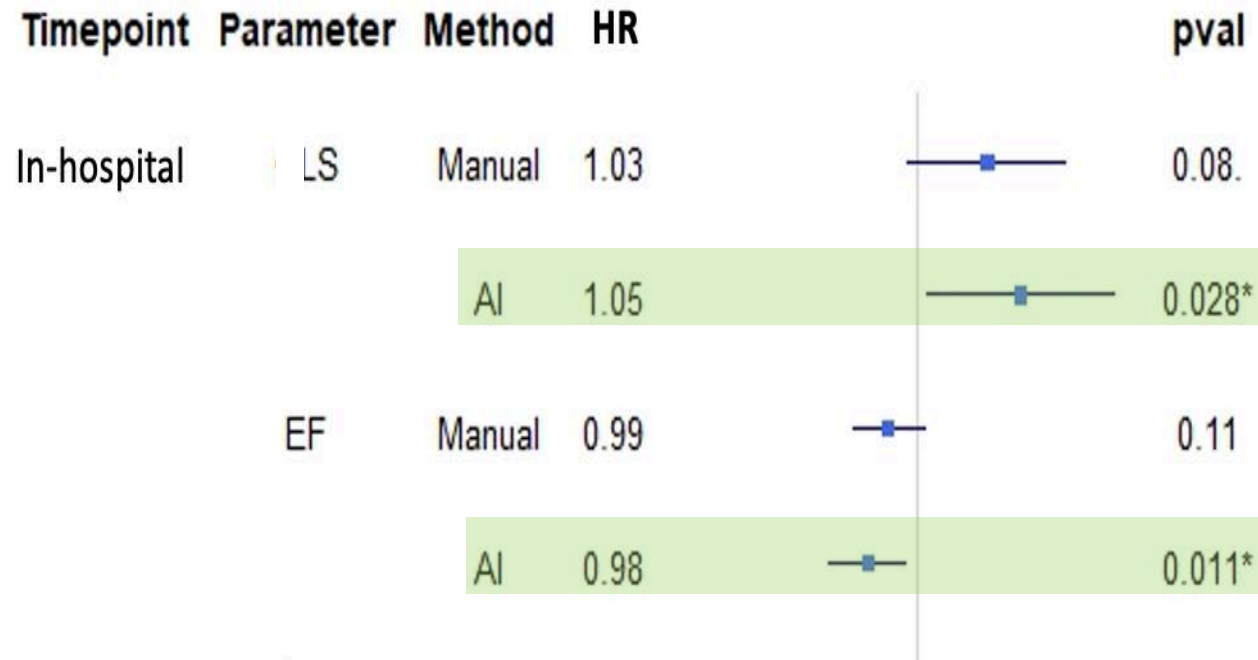
Multivariate Analysis		
<b>Model 1 (LV)</b>		
Age	1.118 [1.051, 1.219]	0.003
<b>LV LS</b>	<b>1.179 [1.045, 1.358]</b>	<b>0.012</b>
LDH (log)	6.17 [1.744, 28.734]	0.009
Previous lung disease	7.322 {1.561, 42.152}	0.015
<b>Model 2 (RV)</b>		
LDH (log)	5.691 [1.898, 20.844]	0.003
Age	1.080 [1.034, 1.141]	0.002
<b>RVFWS</b>	<b>1.136 [1.037, 1.256]</b>	<b>0.007</b>

# Conclusions – Phase 1

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- When measurements were averaged, LV LS, RVFWS, in addition to age, LDH, and previous lung disease were independently associated with in-hospital mortality, while LVEF was not.

# Cox proportional Hazard Regression



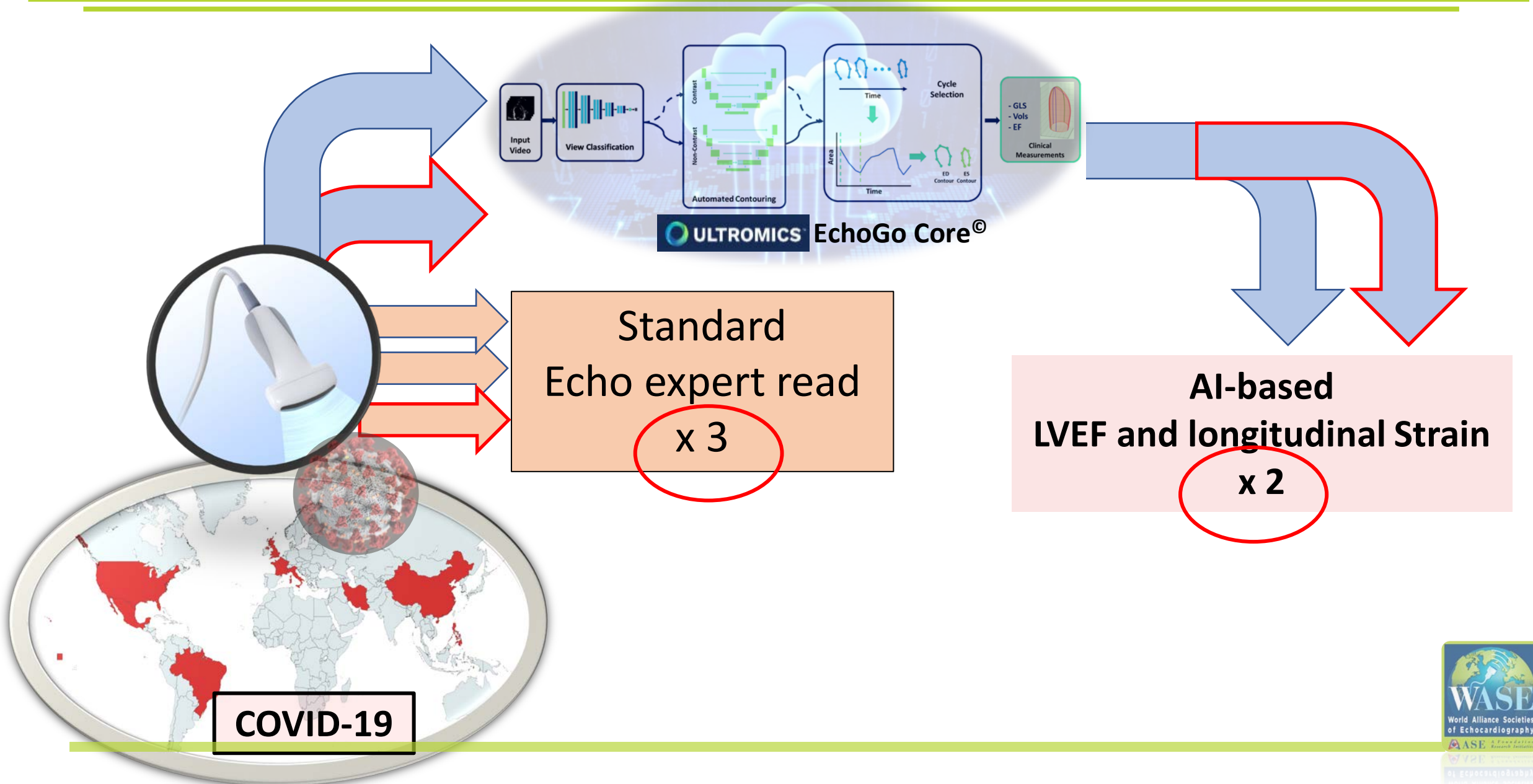


# Hypothesis (Phase 2)

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LVEF and LV LS obtained using AI-derived algorithms will have less inter-reader variability and will result in a better predictor of mortality than expert readers.

# 2D Echo analysis - LVEF, volumes, LV LS



# Prospective Follow-up

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476 TTE read was feasible both by manual and AI

230 ( $\pm$  115) days of follow-up

Mortality was 27.4% (n=238: 188 in-hospital, 50 follow-up)

# Variability – AI

LV EF

Method	Frame selection	N	R (Pearson correlation) [95%CI]	ICC [95%CI]
AI	All	385	0.853 [0.824, 0.878]	0.854 [0.824, 0.879]
Manual		319	0.670 [0.605, 0.727]	0.655 [0.573, 0.722]
AI	Same	49	0.996 [0.994, 0.998]	0.996 [0.993, 0.998]
Manual		14	0.683 [0.239, 0.891]	0.680 [0.240, 0.886]
AI	Different	336	0.832 [0.796, 0.862]	0.832 [0.796, 0.862]
Manual		305	0.671 [0.504, 0.728]	0.654 [0.569, 0.723]

LV LS

AI	All	385	0.789 [0.784, 0.824]	0.789 [0.748, 0.824]
Manual		339	0.430 [0.336, 0.515]	0.430 [0.336, 0.515]
AI	Same	49	0.987 [0.977, 0.993]	0.987 [0.977, 0.993]
Manual		14	0.497 [<0.001, 0.813]	0.510 [<0.001, 0.814]
AI	Different	296	0.761 [0.712, 0.803]	0.761 [0.712, 0.803]
Manual		305	0.427 [0.330, 0.514]	0.426 [0.330, 0.514]

# Factors responsible for Within-Patient Variance

Variable	EF		LS	
	Manual	AI	Manual	AI
	Variance (% total)	Variance (% total)	Variance (% total)	Variance (% total)
Frame	1.033 (1.40%)	2.362 (6.30%)	0.876 (2.74%)	0.588 (5.96%)
Operator	34.946 (47.39%)	0.067 (0.18%)	16.537 (51.81%)	0.140 (1.42%)
Reading Round	<0.0001 (<0.001%)	0.016 (0.04%)	0.115 (0.36%)	0.109 (1.11%)
Image quality	<0.0001 (<0.0001)	<0.0001 (<0.0001)	<0.0001 (<0.0001%)	<0.0001 (<0.0001%)

**Variance in Manual was large and was mostly due to the operator**

**Variance in AI was small and was due to video frame selection**

# Prediction of mortality

## Univariable Logistical Regression

Parameter	Mortality			
	In-Hospital		Follow-up	
	Odd Ratio [95% CI]	p-value	Odd Ratio [95% CI]	p-value
<b>Echocardiographic parameters (Continuous)</b>				
LVEF manual	0.985 [0.969, 1.003]	0.083	0.990 [0.975, 1.005]	0.187
LVEF AI	0.970 [0.952, 0.988]	0.001 ←	0.974 [0.956, 0.991]	0.003 ←
LVLS manual	1.035 [0.999, 1.074]	0.058	1.024 [0.991, 1.059]	0.155
LVLS AI	1.082 [1.035, 1.132]	<0.001 ←	1.060 [1.019, 1.105]	0.004 ←



# Multivariable forward-step logistical regression

Parameter	OR [95% CI]	p-value
LVEF manual	0.983 [0.955, 1.012]	0.255
LVEF AI	0.968 [0.939, 0.997]	0.031
LVLS manual	1.038 [0.975, 1.108]	0.254
LVLS AI	1.096 [1.022, 1.179]	0.012

# Limitations

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- Patients were enrolled in a retrospective manner
- Not all echocardiograms could be quantified
- Echocardiograms did not include sufficient information to assess the left atrium, diastolic function and pulmonary pressures
- Findings may be applicable to patients with COVID-19, not necessarily to other patients
- However, if broadened to a wider patient population with better image quality, it is conceivable that AI contouring could be feasible in a much higher proportion of patients and therefore have more power

# Conclusions (Phase 2)

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- Automated quantification of LVEF and LVLS using AI minimized variability
- AI-based LV analyses, but not manual, were significant predictors of in-hospital and follow-up mortality.
- AI analysis of echoes could increase statistical power to predict outcomes, possibly requiring smaller sample sizes in clinical trials

# WASE-COVID Investigators

Tine Descamps PhD  
Rizwan Sarwar PhD  
Ilya Karagodin MD  
Cristiane Carvalho Singulane MD  
Mingxing Xie MD PhD  
Edwin S Tucay MD  
Ana C Tude Rodrigues MD  
Zuilma Y Vasquez-Ortiz MD PhD  
Mark J. Monaghan PhD  
Bayardo A Ordóñez Salazar MD  
Laurie Soulat-Dufour MD  
Azin Alizadehasl MD  
Atoosa Mostafavi MD  
Antonella Moreo MD  
Rodolfo Citro MD  
Akhil Narang MD  
Chun Wu MD PhD  
Karima Addetia MD  
Ross Upton  
Gary M. Woodward PhD

## Additional WASE COVID Investigators

**Vince Ryan V Munoz MD**, Philippine Heart Center, Quezon City, Philippines;  
**Rafael Porto De Marchi MD**, Radiology institute of the University of Sao Paulo Medical School, São Paulo, Brazil;  
**Sergio M. Alday-Ramirez PhD** and **Consuelo Orihuela MD**, Instituto Nacional de Ciencias Medicas y Nutricion (INCMNSZ), CDMX, Mexico;  
**Anita Sadeghpour MD FASE**, Rajaie Cardiovascular Medical and Center, Echocardiography Research Center, IUMS, Tehran, Iran;  
**Jonathan Breeze MD** and **Amy Hoare**, King's College Hospital, London, UK;  
**Carlos Ixcanparij Rosales MD**, Centro Nacional 20 de Noviembre, ISSSTE, CDMX, Mexico;  
**Ariel Cohen MD**, Hôpitaux de l'est parisien St Antoine-Tenon, Université Pierre et Marie Curie, Paris, France;  
**Martina Milani MD**, **Ilaria Trolese RDCS**, **Oriana Belli MD** and **Benedetta De Chiara MD**, Ospedale Niguarda, Milan, Italy;  
**Michele Bellino MD** and **Giuseppe Iuliano MD**, University of Salerno, Salerno, Italy.

Thank You