



Coronary artery calcification and epicardial adipose tissue as independent predictors of mortality in COVID-19

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Abstract

Recent epidemiological studies have demonstrated that common cardiovascular risk factors are strongly associated with adverse outcomes in COVID-19. Coronary artery calcium (CAC) and epicardial fat (EAT) have shown to outperform traditional risk factors in predicting cardiovascular events in the general population. We aim to determine if CAC and EAT determined by Computed Tomographic (CT) scanning can predict all-cause mortality in patients admitted with COVID-19 disease. We performed a retrospective, post-hoc analysis of all patients admitted to Montefiore Medical Center with a confirmed COVID-19 diagnosis from March 1st, 2020 to May 2nd, 2020 who had a non-contrast CT of the chest within 5 years prior to admission. We determined ordinal CAC scores and quantified the epicardial (EAT) and thoracic (TAT) fat volume and examined their relationship with inpatient mortality. A total of 493 patients were analyzed. There were 197 deaths (39.95%). Patients who died during the index admission had higher age (72, [64–80] vs 68, [57–76]; $p < 0.001$), CAC score (3, [0–6] vs 1, [0–4]; $p < 0.001$) and EAT (107, [70–152] vs 94, [64–129]; $p = 0.023$). On a competing risk analysis regression model, $CAC \geq 4$ and $EAT \geq$ median (98 ml) were independent predictors of mortality with increased mortality of 63% ($p = 0.003$) and 43% ($p = 0.032$), respectively. As a composite, the group with a combination of $CAC \geq 4$ and $EAT \geq 98$ ml had the highest mortality. CAC and EAT measured from chest CT are strong independent predictors of inpatient mortality from COVID-19 in this high-risk cohort.

Keywords Covid · Coronary artery calcium · Epicardial adipose tissue · Mortality

Introduction

Coronavirus disease (COVID-19), caused by the severe acute respiratory syndrome coronavirus 2 (SARS-CoV-2) has rapidly spread globally. Although most cases recover, COVID-19 still appears to retain an elevated mortality with the number of deaths escalating to over 1.5 million worldwide through December 2020 [1]. COVID-19 is associated with a high incidence of thrombotic complications. It has

been suggested that the thrombotic diathesis associated with COVID-19 reflects endothelial cell dysfunction [2]. The severity of COVID-19 is characterized by a pro-inflammatory state [3]. Recent epidemiological studies have demonstrated that common cardiovascular risk factors, including hypertension, diabetes, chronic kidney disease and obesity are strongly associated with adverse outcomes in COVID-19 [4, 5] with patients from ethnic minorities at a particular risk [5]. Computed tomographic (CT) scanning can be used to detect and quantify visceral fat. In the past few years, epicardial adipose tissue (EAT) has attracted a lot of interest as a marker of cardiometabolic risk as an independent marker for coronary atherosclerosis development and progression [6]. EAT is a metabolically active fat depot that makes up for approximately 20% of total heart weight, lies between serous epicardium and the fibrous pericardium, and can be quantified from non-gated non-contrast chest CT [7]. EAT is strongly associated with subclinical atherosclerosis, inflammation and major cardiac events in asymptomatic subjects

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[8]. EAT can influence cardiomyocytes and cardiac function via a secretion of proinflammatory adipokines. CT scanning can also identify the presence and extent of coronary atherosclerosis. The coronary artery calcification scoring (CAC) is an established and extensively validated imaging biomarker for cardiovascular risk, allowing enhanced risk reclassification for the prediction of all cause and cardiac specific mortality in asymptomatic subjects [9]. CAC has demonstrated to be a better predictor of cardiovascular and all-cause mortality across the spectrum of traditional risk factors [10]. Although the traditional Agatston method for measuring CAC requires ECG-gated acquisition, good correlation has been demonstrated between CAC identified on non-gated CT scans and ordinal scores obtained from gated CT scans [11]. Our hypothesis was that presence of EAT and/or CAC, as markers of a pro-inflammatory milieu and coronary atherosclerosis, respectively, are independently associated with increased risk for death in COVID-19.

Methods

We conducted a retrospective, post-hoc analysis of all patients who were admitted to Montefiore Medical Center with a confirmed COVID-19 diagnosis by Polymerase Chain Reaction (PCR) from March 1st, 2020 to June 23rd, 2020. Sample for RT-PCR was obtained by either nasopharyngeal or oropharyngeal swab. The follow up period was from March 1st, 2020 to June 26th, 2020. Patients who had a non-contrast CT of the chest at our facility after March 1st, 2015 constituted the main study cohort. Baseline demographic, clinical and laboratory variables (including inflammatory biomarkers) were retrieved from our electronic medical record system. Baseline characteristics and outcomes were compared with patients who were admitted with COVID-19 but did not have a CT study performed. The investigators had direct access to primary data.

The study was approved by our Institutional Review Board (Office of Human Research Affairs at Albert Einstein College of Medicine).

CT acquisition

Patients were imaged on the following CT scanners without contrast administration or electrocardiographic gating: GE Optima 660, GE Lightspeed VCT, Neurologica Corp Caretom, Siemens Somatom Sensation 16 and GE Optima CT 540. Images were reconstructed at 2.5 mm slice thickness. Scans with reconstructions at different slice thickness were excluded.

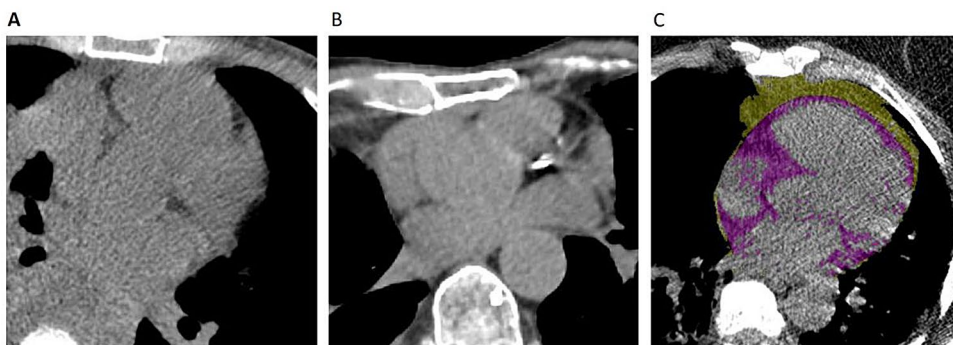
Coronary calcium score (CAC)

Two readers blinded from clinical data calculated ordinal scores from standard non-gated chest CT studies using the methods described by Shemesh et al. for patients without history of PCI or CABG [11]. Briefly, the right coronary artery, left main, left anterior descending, and left circumflex arteries were each given a score of 0–3 for presence and extent of calcium with 0 (none), 1 (< 1/3 of the artery length calcified), 2 ($\geq 1/3$ to < 2/3 calcified), and 3 ($\geq 2/3$ calcified). These scores were summed across the 4 arteries, providing a range of possible scores from 0 to 12 (See Fig. 1a and b). We calculated the inter-observer variability based on a random sample. Agreement for severity class was high (Interclass Correlation Coefficient = 0.980, $p < 0.001$).

Quantification of EAT and TAT

For the measurement of EAT, we used QFAT software. As previously described [12], QFAT uses convolutional deep learning for fully automated quantification of epicardial and thoracic volumes. Accuracy and reproducibility of QFAT have been previously validated [13, 14]. Contours were reviewed by an expert user and manually modified when needed. Superior and inferior limits of the pericardium were identified as the bifurcation of the pulmonary trunk and the posterior descending artery respectively. EAT was defined as adipose tissue in the pericardium and TAT as the fat in the mediastinum within the abovementioned parameters but

Fig. 1 CAC, EAT and TAT. **a** Patient with CAC=0 who survived. **b** Patient with CAC=9 who died. **c** Patient with EAT= 138 ml and TAT= 130 ml who died; EAT highlighted in purple by QFAT Software



outside the pericardium (See Fig. 1c). Patients with significant artifacts from ICDs or poor acquisition were excluded.

Statistical analysis

Continuous data are displayed as mean \pm standard deviation or median [25–75% interquartile range] and compared with the Student's t-test, or Wilcoxon ranks-sum, as appropriate. Categorical data are presented as percent and compared by the chi-squared test. As hospital discharge is a competing event with in-hospital mortality, instead of a Cox regression model, we used a proportional hazards model for the sub-distribution of a competing risk analysis adjusting for covariates by Fine and Gray's method [15–17] to estimate the difference in the cumulative incidence of the outcome. June 26th, 2020 was the end of the censoring period. Intraclass correlation coefficient was calculated to determine interrater agreement. Pearson's product-moment correlation was utilized to assess the relationship between variables. A $p < 0.05$ was considered statistically significant. Statistical analysis was performed with SPSS (IBM Corp, ver. 25, Armonk, NY) and the R v3.3 package CMPSK (R Foundation for Statistical Computing, ver 3.3, Vienna, Austria).

Results

Study population and baseline characteristics.

From 4311 patients who were hospitalized at Montefiore between March 1st and June 23rd, 2020 with confirmed COVID-19 by PCR, we identified 504 patients who had a non-contrast chest CT performed during or within 5 years prior to admission. 11 patients were excluded due to PCI, CABG or artifact. 493 patients were finally included for the clinical outcomes (455 for CAC and 457 for QFAT analysis). Overall median age was 70 (IQR 60–77) years, 49.5% were male and 33.3% Hispanic. Diabetes (DM) (62.3%), hyperlipidemia (74.6%), hypertension (88.6%) and asthma/COPD (52.3%) were highly prevalent. The overall Charlson comorbidity index was 7 (IQR 4–10). On average patients presented to the hospital 2 days after onset of symptoms (IQR 0–5). There were 197 deaths with an in-hospital mortality of 40.0%. Amongst traditional risk factors, patients who died were older (72, IQR 64–80 vs 68, IQR 57–76 years; $p < 0.001$), more likely to have history of CAD (54.8 vs 44.3%; $p = 0.021$) and a higher Charlson comorbidity index (8, IQR 5–11 vs 7, IQR 4–10; $p = 0.004$). See Table 1. There was no significant difference in body-mass index (27.5, IQR 22.1–31.9 vs 27.2, IQR 23.9–32.0 kg/m^2 ; $p = 0.314$), DM (64.5 vs 60.8%; $p = 0.412$), hypertension (89.8 vs 87.8%; $p = 0.491$), hyperlipidemia (75.6 vs 74.0%; $p = 0.680$) or asthma/COPD (52.3 vs 52.4%; $p = 0.986$).

On presentation, patients who died had higher heart rate (97, IQR 85–112 vs 93, IQR 79–105 beats per minute; $p = 0.009$), respiratory rate (20, IQR 18–25 vs 19, IQR 18–20 breaths per minute; $p < 0.001$) and lower oxygen saturation (94, IQR 88–98 vs 96, IQR 93–98%; $p < 0.001$). There were no differences on days between onset of symptoms and hospital admission, temperature, systolic blood pressure or diastolic blood pressure.

Laboratory values on admission showed that patients who died had higher white blood count (8.2, IQR 5.6–12.9 vs 6.9, IQR 4.7–9.5; $p < 0.001$), lower hemoglobin (11.3, IQR 9.9–13.6 vs 12.2, IQR 10.4–13.4; $p < 0.001$), lower estimated eGFR (31, IQR 15–61 vs 58, IQR 31–81; $p < 0.001$) and higher of the following parameters: pro-BNP (3,048, IQR 765–15,000 vs 637, IQR 150–2,527; $p < 0.001$), glucose (138, IQR 112–2058; 126, IQR 102–174; $p = 0.014$), d-dimer (2.8, IQR 1.3–5.4 vs 1.8, IQR 0.9–3.8; $p = 0.023$), C-reactive protein (14.2, IQR 7.7–24.8 vs 8, IQR 2.7–16.3; $p < 0.001$), LDH (451, IQR 306–610 vs 329, IQR 266–426; $p < 0.001$), ferritin (1062, IQR 370–2717 vs 537, IQR 280–1256; $p = 0.008$), pro-calcitonin (0.8, IQR 0.3–5.4 vs 0.2, IQR 0.1–0.9; $p < 0.001$) and troponin (0.03, IQR 0.01–0.09 vs 0.01, IQR 0.01–0.03; $p < 0.001$).

Patients who died were more likely to receive antibiotics (90.9 vs 74.7%; $p < 0.001$), statins (39.6 vs 16.9%; $p < 0.001$) and less likely to be on angiotensin-receptor blocking agents (36.0 vs 45.6; $p = 0.035$). There was no difference in the use of hydroxychloroquine (67.5 vs 63.5%; $p = 0.361$), azithromycin (25.4 vs 28.0%; $p = 0.515$) or intravenous steroids (6.1 vs 10.5%; $p = 0.091$) administration between the groups. History of CAD mildly correlated with the presence of $\text{CAC} \geq 1$ ($r = 0.331$, $p < 0.001$). 53.9% of patients without history of CAD had $\text{CAC} \geq 1$ and 15.0% of patients with history of CAD had $\text{CAC} = 0$. As predictor of mortality, history of CAD had an AUC of 0.551 with $p = 0.075$.

When compared to the group admitted for COVID-19 within the same timeframe without a prior CT within 5 years ($n = 3,807$), patients with no CT were younger (65 [54–77] vs 70 [60–77]; $p < 0.001$), had higher BMI (28.8 [24.9–33.9] vs 27.3 [23.3–31.9]; $p < 0.001$), had less DM (51.9 vs 62.3%; $p < 0.001$), hyperlipidemia (55.0 vs 74.6%; $p < 0.001$), hypertension (69.5 vs 88.6%, $p < 0.001$), CAD (23 vs 48.5%, $p < 0.001$) and lung disease (25.2 vs 52.3%, $p < 0.001$). There was no difference in gender (53.2 vs 49.5%, $p = 0.12$). Mortality for the cohort without prior CT was lower than one with prior CT (28.1 vs 40.0%, $p < 0.001$).

Coronary artery calcium

Ordinal CAC score was calculated in 455 patients. $\text{CAC} > 0$ was present in 308 patients with 153 patients having mild (1–3), 94 moderate (4–6) and 61 severe (7–12) CAC with an overall population median CAC score of 2

Table 1 Baseline characteristics of patients admitted with COVID-19

		All n = 493	Alive n = 296	Dead n = 197	p
Demographics					
Age, year	n = 493	70 (60–77)	68 (57–76)	72 (64–80)	< 0.001
BMI (kg/m ²)	n = 482	27.3 (23.3–31.9)	27.2 (23.9–32)	27.5 (22.1–31.9)	0.314
Male gender, no (%)	n = 493	244/493 (49.5)	148/296 (50)	96/197 (48.7)	0.783
PMH					
Diabetes, no (%)	n = 493	307/493 (62.3)	180/296 (60.8)	127/197 (64.5)	0.412
Hyperlipidemia, no (%)	n = 493	368/493 (74.6)	219/296 (74)	149/197 (75.6)	0.680
Hypertension, no (%)	n = 493	437/493 (88.6)	260/296 (87.8)	177/197 (89.8)	0.491
Asthma/COPD, no (%)	n = 493	258/493 (52.3)	155/296 (52.4)	103/197 (52.3)	0.986
Coronary artery disease (CAD)	n = 493	296/493 (60.0)	131/296 (44.3)	108/197 (54.8)	0.021
Charlson Score	n = 493	7 (4–10)	7 (4–10)	8 (5–11)	0.004
Presentation					
Symptom duration, days	n = 476	2 (0–5)	2 (0–5)	2 (0–4)	0.073
Temperature, F	n = 489	98.6 (98.0–99.7)	98.6 (98.0–99.6)	98.7 (98.0–99.8)	0.421
Systolic BP, mmHg	n = 492	131 (111–148)	133 (114–149)	128 (107–147)	0.085
Diastolic BP, mmHg	n = 490	73 (62–83)	73 (63.5–84)	72 (58.5–82)	0.084
HR, bpm	n = 491	95 (81–109)	93 (79–105)	97 (85–112)	0.009
Pulse oximeter saturation, %	n = 490	95 (91–98)	96 (93–98)	94 (88–98)	< 0.001
Respiratory rate, bpm	n = 490	20 (18–22)	19 (18–20)	20 (18–25)	< 0.001
WBC count, k/μl	n = 482	7.3 (4.9–10.8)	6.9 (4.7–9.5)	8.2 (5.6–12.9)	< 0.001
Hemoglobin, g/dl	n = 482	11.9 (10.2–13.4)	12.2 (10.4–13.4)	11.3 (9.9–13.6)	0.045
Sodium, mEq/l	n = 479	137 (134–141)	137 (133–141)	138 (134–143)	0.022
EGFR, ml/min/BSA	n = 481	48 (21–76)	58 (30–81)	31 (15–61)	< 0.001
Glucose	n = 481	130 (107–188)	126 (102–174)	138 (112–205)	0.014
Lactic acid, mmol/l	n = 431	2 (1.5–2.9)	1.8 (1.4–2.6)	2.3 (1.6–3.3)	< 0.001
ProBNP, pg/ml	n = 263	1223 (227–5751)	637 (150–2527)	3049 (765–15,000)	< 0.001
D-dimer, μg/ml	n = 199	2.1 (1–4.4)	1.8 (0.9–3.8)	2.8 (1.3–5.4)	0.023
C-reactive protein, μg/ml	n = 229	10.3 (4.1–19.2)	8 (2.7–16.3)	14.2 (7.7–24.8)	< 0.001
Fibrinogen, mg/dl	n = 142	634 (492–744)	622 (471–735)	645 (521–762)	0.148
LDH, U/l	n = 299	364 (278–490)	329 (266–426)	451 (306–610)	< 0.001
Ferritin, ng/ml	n = 178	656 (309.3–1771)	537 (280–1256)	1062 (340–2717)	0.008
Troponin T, ng/ml	n = 406	0.01 (0.01–0.06)	0.01 (0.01–0.03)	0.03 (0.01–0.09)	< 0.001
Medications during admission					
Hydroxychloroquine, no (%)	n = 493	321/493 (65.1)	188/296 (63.5)	133/197 (67.5)	0.361
Azithromycin, no (%)	n = 493	133/493 (27)	83/296 (28)	50/197 (25.4)	0.515
Other antibiotics, no (%)	n = 493	400/493 (81.1)	221/296 (74.7)	179/197 (90.9)	< 0.001
IV steroids, no (%)	n = 493	43/493 (8.7)	31/296 (10.5)	12/197 (6.1)	0.091
ACE, no (%)	n = 493	25/493 (5.1)	16/296 (5.4)	9/197 (4.6)	0.678
ARBS, no (%)	n = 493	206/493 (41.8)	135/296 (45.6)	71/197 (36)	0.035
Statin, no (%)	n = 493	128/493 (26)	50/296 (16.9)	78/197 (39.6)	< 0.001
CAC and EAT					
CAC ≥ 1	n = 455	308/455 (67.7)	177/274 (64.6)	131/181 (72.4)	0.08
CAC	n = 455	2 (0–5)	1 (0–4)	3 (0–6)	< 0.001
Epicardial fat, ml	n = 457	98 (67–141)	94 (64–129)	107 (70–152)	0.023
Thoracic fat, ml	n = 457	174 (111–270)	169 (108–252)	187 (115–291)	0.061

Columns show the different demographic, clinical, laboratory and CT values of the overall group (All), those who survived (Alive) and those who died (Dead). P value compared alive vs dead groups

ALT Alanine transaminase; *AST* Aspartate transaminase; *BMI* Body mass index; *BP* Blood pressure; *BUN* Blood urinary nitrogen; *CAC* Ordinal Coronary artery calcium; *CAD* Coronary artery disease; *COPD* Chronic obstructive pulmonary disease; *EGFR* Estimated glomerular filtration rate; *F* Fahrenheit; *HR* Heart rate; *IL-6* Interleukin 6; *IV* Intravenous; *LDH* Lactate dehydrogenase; *proBNP* ProB-type natriuretic peptide; *WBC* White blood cell

(IQR 0–5). Patients who died had higher ordinal CAC score (3, IQR 0–6 vs 1, IQR 0–4; $p < 0.001$; Fig. 2). Patients with $CAC \geq 4$ were older (76.0 [68.0–82.0] vs 66 [56.0–74.8]; $p < 0.001$), with lower BMI (25.8 [22.8–31.0] vs 28.2 [23.9–32.5]; $p < 0.001$), higher percentage hyperlipidemia (81.9 vs 68.7%, $p < 0.001$), and CAD (61.3 vs 35.5%, $p < 0.001$). There was no difference on gender (male 52.9 vs 45.0%, $p = 0.11$), DM (67.1 vs 58.7%, $p = 0.08$), hypertension (91.6 vs 86.0%, $p = 0.08$) or lung disease (54.8 vs 50.3%, $p = 0.36$). When adjusted for age, BMI, DM, HLD and HTN, CAC remained an independent risk factor for in-hospital mortality (OR 1.082, $p = 0.005$). For each point increase in CAC, mortality increased by 8%. On a ROC curve analysis CAC showed an AUC of 0.602 ($p < 0.001$). A $CAC \geq 4$ was associated with a crude mortality of 53% (OR 1.634. See Fig. 3A; $p = 0.003$). $CAC \geq 4$ remained as an independent predictor of mortality when adjusted for Charlson index (OR 1.818, $p < 0.001$). Additionally, ASCVD risk by the pooled cohort

equation was not a good predictor of COVID-19 death (AUC for ASCVD 0.538, $p = 0.439$).

Epicardial adipose tissue

EAT and TAT were calculated in 457 patients. Median volume in the overall population was 98 ml (67–141) and 174 ml (111–270) for EAT and TAT, respectively. Patients who died had higher EAT volume (See Fig. 3b; 107 ml, IQ 70–152 vs 94 ml, IQ 64–129; $p = 0.023$). On a ROC curve analysis EAT showed an AUC of 0.565 ($p = 0.024$). In contrast, TAT volumes did not differ between those who died and those who survived (187 ml, IQ 115–291 vs 169 ml, IQ 108–252; $p = 0.061$). Patients with EAT over the median were older (71.0 [63.0–79.0] vs 65.5 [56.8–76.0]; $p < 0.001$, with higher BMI (28.6 [25.2–33.3] vs 25.4 [21.3–30.1]; $p < 0.001$), higher percentage of hyperlipidemia (83.8 vs 64.4%, $p < 0.001$), DM (68.5 vs 57.2%, $p = 0.01$), hypertension (93.2 vs 84.7%, $p = 0.004$), CAD (55.3 vs 38.3%,

Fig. 2 Mortality according to CAC severity. Bars show the median and interquartile range of CT patients with different CAC severity categories as per Shemesh et al. [11]. Patients with intermediate (CAC 4–6; $n = 94$) and high (CAC 7–12; $n = 61$) coronary calcification had significantly increased mortality when compared to ones without (CAC 0; $n = 147$) or with low (1–3; $n = 153$) calcification. (CAC 4–6 and CAC 7–12 vs CAC 0 and CAC 1–3; $p < 0.01$)

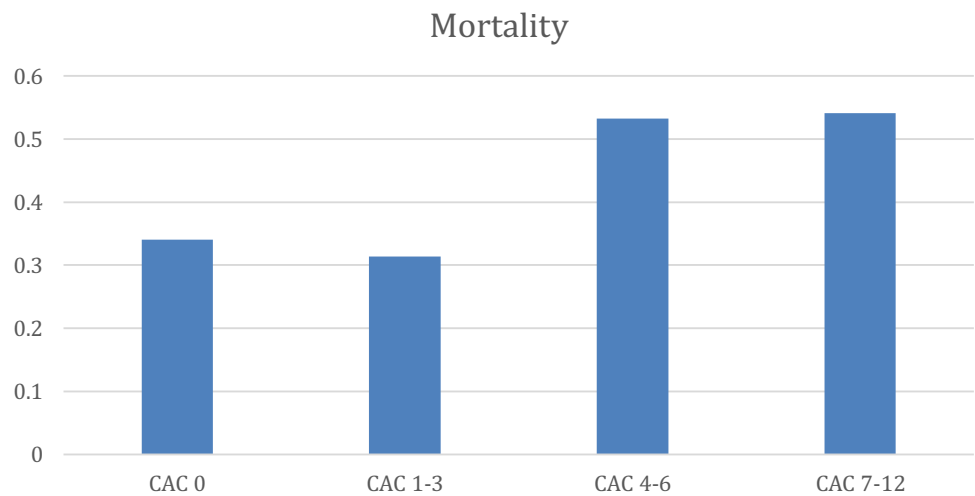
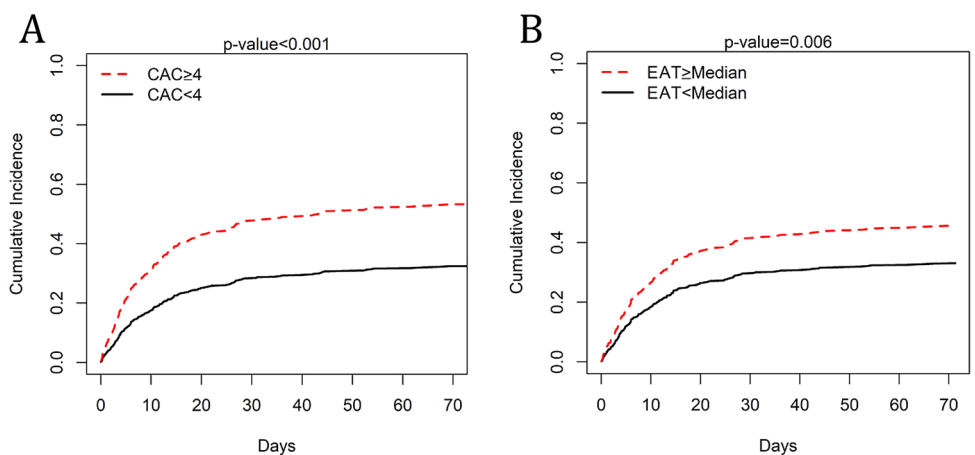


Fig. 3 Mortality in relation to $CAC \geq 4$ and $EAT \geq$ Median. Curves show cumulative incidence of death in days according to CAC score (a) and EAT (b)



$p < 0.001$) and lung disease (57.4 vs 46.4, $p = 0.02$). There was no difference on gender between the groups. There was a mild correlation between BMI and EAT ($r = 0.33$, $p < 0.001$). When adjusted for age, BMI, DM, HLD and HTN, an EAT value above the median remained an independent risk factor for in-hospital mortality (crude mortality 46%; OR 1.435, $p = 0.032$). $EAT \geq$ median remained as an independent predictor of mortality when adjusted for Charlson index (OR 1.534, $p = 0.007$).

When taken together, patients with $CAC \geq 4$ and $EAT \geq$ median had the highest in-hospital mortality, See Fig. 4. $CAC < 4$ and $EAT <$ median (26%, 35/134); $CAC < 4$ and $EAT \geq$ median (28%, 54/141); $CAC \geq 4$ and $EAT <$ median (46%, 31/68) and $CAC \geq 4$ and $EAT \geq$ median (59%, 45/76), $p < 0.001$.

Discussion

The main finding in our study is the independent association of CAC and EAT with all-cause mortality in a large cohort of patients admitted with COVID-19. This association was observed even after correcting for traditional risk factors that have been linked to worse COVID-19 outcomes such as age, BMI, diabetes, hypertension and hyperlipidemia.

To our knowledge, this represents the first study to show an independent association of CAC score and EAT with in-hospital mortality in confirmed COVID-19 patients. We showed that for each point increase in CAC, mortality increased by 8%. On a regression model $CAC \geq 4$ independently increased mortality by 63% (Fig. 3a) and an $EAT \geq$ median (98 ml) by 43%. Importantly when taken in combination, the group with $CAC \geq 4$ and $EAT \geq$ median had highest mortality ($p < 0.001$; Fig. 4).

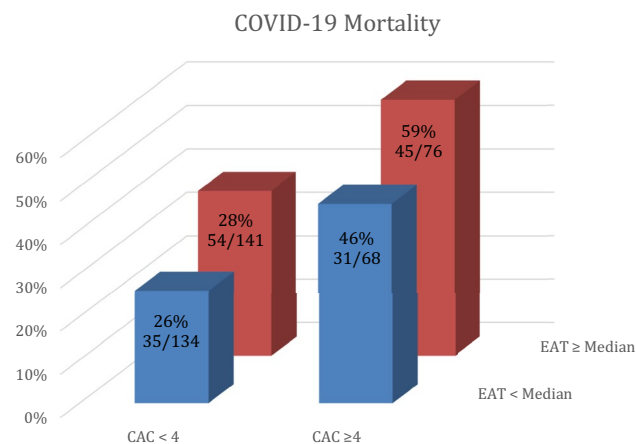


Fig. 4 Composite COVID-19 mortality for combination of CAC and EAT. Columns show percent of mortality for each group

It has been demonstrated that EAT is metabolically different from other visceral fat, both biochemically and in relation to cardiac risk factors. Multiple studies have postulated a prognostic role of EAT for clinical outcomes. Moreover, the role of EAT is incremental beyond CAC scoring [18]. Zhou et al. demonstrated that prediction of obstructive CAD was improved when $EAT > 100$ ml (as a binary marker) was added to a model based on age, gender, angina and CAC in patients with stable angina [19]. Larsen et al. found a significant association of epicardial but not thoracic adipose tissue with earlier all-cause mortality in older adults over a 12-year follow up period [20].

Additionally, Gauss et al. found a significant association between CAC, EAT and systemic inflammatory markers [21]. Severity of COVID-19 infection has been associated to an immune dysregulation [22]. In particular, monocytes from COVID-19 patients have sustained expression of the cytokines tumor necrosis factor (TNF) and interleukin-6 (IL-6) [23]. Mazurek et al. found that EAT is a source of several inflammatory mediators in high-risk cardiac patients with local expression of monocyte chemoattractant protein (MCP)-1, IL-6 and TNF- α [24]. Other studies have also shown that EAT has prognostic value independently from clinical risk factors. One small study by Eslami et al. recently showed a relationship between EAT density and COVID-19 mortality but did not see an association with EAT thickness [25].

It is known that baseline pro-inflammatory risk factors (such as diabetes, hypertension, CAD and COPD) exacerbate the cytokine storm related to severe cases of COVID-19 [26]. We showed here that EAT, possibly through a pro-inflammatory local response has independent predictive value of all-cause mortality in COVID-19 [27].

Systemic inflammation adversely influences the biology of epicardial adipose tissue, promoting the expression of a proinflammatory phenotype. Furthermore, the release of pro-inflammatory adipocytokines from epicardial adipose tissue may contribute to the systemic inflammatory state as EAT appears to be a transducer that mediates the influence of systemic inflammation on adjacent tissues [28].

Measurement of EAT by CT has represented in the past a cumbersome process limiting its clinical applicability. Fully automated quantification by QFAT, through the use of a convolutional neural network approach, brings measurement process to a clinically useful and readily available tool with an average quantification time of 1.57 s [14]. Importantly, EAT quantification does not require ECG-gating nor additional radiation or acquisition time and the calculation through QFAT requires little to no training.

Data from multiple cohorts shows that CAC effectively stratifies patients for risk of long-term all-cause and cardiovascular mortality better than traditional risk-factors [9, 10, 29, 30]. On the contrary, the effects of CAC on hospital mortality due to sepsis have been less explored. In one

small study, Gupta et al. demonstrated that CAC stratifies septic patients for cardiovascular complications better than traditional risk factors [31]. CAC score was also evaluated in COVID-19 patients in smaller trials. A study from an Italian cohort of patients (332 patients, 68 deaths and mortality of 20.5%) found a correlation between CAC on admission and mortality that did not persist after multivariate correction [32]. Compared to our study, patients in the study by Ferrante et al. had significantly lower comorbidities with less diabetes and dyslipidemia and lower incidence of CAC (CAC ≥ 1 of 43.9% vs. 76.7% in our study) and a lower incidence of events, possibly explaining the different findings. Other small studies suggested a correlation of CAC and adverse events such as mechanical ventilation/ECMO or death [33–35]. Due to smaller sample size and lower event rate, these studies were hypothesis generating but could not confirm the premise.

Lastly, CAC ≥ 4 and AET \geq median had AUC of 0.596 ($p=0.001$) and 0.565 ($p=0.024$), respectively, whereas history of CAD had an AUC of 0.551 without statistical significance ($p=0.075$) with a large percentage of patients having undiagnosed CAC ≥ 1 (53.9%) and 15.0% of patients with history of CAD but CAC = 0.

Our findings could have significant clinical implications on selection of higher risk patients for allocation of vaccines or admission beds in particular in countries with limited resources.

Limitations

The inclusion of only patients who had a prior chest CT selected a higher risk population, reflected in the higher mortality rate observed on patients with prior CT. Moreover, CTs were obtained up to 5 years before index hospitalization. Even that progression of coronary calcification within 5 years tends to be mild and within a severity class, we cannot exclude higher variation in some of our patient's population. However, we believe it is extremely important to have risk stratifying tools in sicker patients with higher risk for adverse events. Many inflammatory markers were not routinely collected at the beginning of the pandemic and we cannot therefore evaluate their interaction. Smoking is known to worsen COVID-19 outcomes, but smoking status could not be consistently ascertained. In our study, EAT showed only a modest additive value to CAC for predicting mortality. Co-linearity between variables and the high percentage of CAC in our population are possible explanations for this finding. Hypothetically, in a younger population EAT could have shown a larger additive value.

Finally, our cohort was selected from the initial wave of patients admitted to the hospital. Since the onset of the COVID-19 pandemic, treatment has evolved, and mortality

of hospitalized patients has dramatically decreased. Thus, our results should be prospectively confirmed.

Conclusion

CAC and EAT measured by non-contrast chest CT are independent predictors of in-patient COVID-19 mortality in this high-risk cohort.

Author contributions LS: Conceptualization, Methodology, Validation, Formal Analysis, Investigation, Resources, Data Curation, Writing-Original Draft, Visualization, Supervision; FC: Conceptualization, Methodology, Validation, Formal Analysis, Investigation, Data Curation, Writing-Review & Editing; AS: Investigation; EN: Investigation; RS: Investigation; DD: Software, Writing-Review & Editing, Funding Acquisition; UPJ: Conceptualization, Writing-Review & Editing; JML: Conceptualization, Methodology, Validation, Resources, Data Curation, Investigation; MJG: Conceptualization, Methodology, Validation, Formal Analysis, Investigation, Resources, Data Curation, Writing-Review & Editing, Visualization, Supervision, Project Administration.

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Declarations

Conflict of interest The authors declare that they have no conflict of interest.

Ethical Approval All human studies have been approved by the appropriate ethics committee and have therefore been performed in accordance with the ethical standards laid down in the 1964 Declaration of Helsinki and its later amendments. The study was approved by our Institutional Review Board (Office of Human Research Affairs at Albert Einstein College of Medicine).

Consent to participate Consent requirement was waived as per IRB guidelines.

Consent for publications Consent requirement was waived as per IRB guidelines.

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