

Increased angiotensin-converting enzyme 2, sRAGE and immune activation, but lowered calcium and magnesium in COVID-19: association with chest CT abnormalities and lowered peripheral oxygen saturation.

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## Abstract

**Background.** The characterization of new biomarkers of COVID-19 is extremely important. Few studies measured the soluble receptor for advanced glycation end product (sRAGE), angiotensin-converting enzyme 2 (ACE2), calcium and magnesium in COVID-19.

**Aims:** To measure sRAGE, ACE2, interleukin (IL)-6, IL-10, CRP, calcium, magnesium, and albumin in COVID-19 patients in association with peripheral oxygen saturation (SpO<sub>2</sub>) and chest CT scan abnormalities (CCTA) including ground glass opacities.

**Methods.** This study measured sRAGE, ACE2, IL-6, IL-10, CRP using ELISA techniques, and calcium, magnesium, and albumin using a spectrophotometric method in 60 COVID-19 patients and 30 healthy controls.

**Results.** COVID-19 is characterized by significantly increased IL-6, CRP, IL-10, sRAGE, ACE2, and lowered levels of SpO<sub>2</sub>, albumin, magnesium and calcium. Neural networks showed that a combination of calcium, IL-6, CRP, and sRAGE yielded an accuracy of 100% in detecting COVID-19 patients with calcium being the most important predictor followed by IL-6, and CRP. COVID-19 patients with CCTAs showed lower SpO<sub>2</sub> and albumin levels than those without CCTAs. SpO<sub>2</sub> was significantly and inversely correlated with IL-6, IL-10, CRP, sRAGE, and ACE2, and positively with albumin, magnesium and calcium. Patients with positive IgG results showed a significant elevation in the serum level of IL-6, sRAGE, and ACE2 compared to the negatively IgG patient subgroup.

**Conclusion.** The results show that immune-inflammatory and RAGE pathway biomarkers may be used as external validating criterion for the diagnosis COVID-19. Those pathways coupled with lowered SpO<sub>2</sub>, calcium and magnesium are drug targets that may help to reduce the consequences of COVID-19.

**Keywords:** COVID-19, sRAGE, ACE2, inflammation, immune, oxidative stress, IL-6, IL-10, biomarkers.

## Introduction

Severe acute respiratory syndrome coronavirus-2 (SARS-CoV-2)-induced coronavirus disease-19 (COVID-19) is one of the biggest threats of our time (Azkur *et al.*, 2020). The clinical spectrum of SARS-CoV-2 infection tends to be very wide, ranging from asymptomatic infection, minor illness to moderate upper respiratory tract disease to serious viral pneumonia with respiratory failure and death (Song *et al.*, 2020, Zhou *et al.*, 2020b). SARS-CoV-2 may invade the pulmonary cells and damage lung tissues (Xu *et al.*, 2020). Although the quantitative rRT-PCR has been identified as the gold-standard for COVID-19 diagnosis, there are many difficulties, including the high cost and in its use because the test is time-consuming and needs availability of instruments and trained staff (Oliveira *et al.*, 2020). Serological assays of SARS-CoV-2 antibodies are relatively easier to perform, but these assays show lower diagnostic performance, for example, because antibodies occur later in the disease (Zainol Rashid *et al.*, 2020). Chest computed tomography and the assessment of ground-glass opacities, consolidation, crazy-paving patterns is of key importance for the early detection and prognosis and evaluation of the severity of COVID-19 pneumonia (Dai *et al.*, 2020, Pan *et al.*, 2020). Chest CT abnormalities (CCTA) have been reported in more than 70% of RT-PCR test-proven COVID-19 cases, including ground-glass opacities (GGOs), vascular enlargement, bilateral abnormalities, lower lobe involvement, and posterior predilection (Adams *et al.*, 2020). Peripheral oxygen saturation (SpO<sub>2</sub>, with a normal range of 92%-98% (Shenoy *et al.*, 2020), is often decreased in COVID-19 and especially in the more severe cases and stages of CCTAs (Dai *et al.*, 2020, Luks and Swenson, 2020).

Due to high morbidity and mortality and lack of adequate treatments for seriously ill patients (Guan *et al.*, 2020b, MacLaren *et al.*, 2020), early identification and prediction of prognosis are crucial. Therefore, the development of biomarker tools to confirm the diagnosis and

estimate the prognosis of SARS-CoV-2 infection, and to discover new drug targets to treat the consequences of the infection are an important field of study.

Recent studies showed increased levels of angiotensin-converting enzyme 2 (ACE2) following SARS-CoV-2 infection (Patel *et al.*, 2021), and a case report showed very high ACE2 levels in a critically ill COVID-19 patient (Nagy *et al.*, 2021). ACE2 is a common binding site for both SARS-CoV and SARS-CoV-2 (Zhu *et al.*, 2018, Hoffmann *et al.*, 2020). COVID-19 virus binds to ACE2 receptors in human cells through Spike proteins-S homotrimers with high affinity and leads mainly to endocytosis through the pathway of "clathrin-mediated endocytosis (Amini Pouya *et al.*, 2020). After attachment, transmembrane serine protease 2 (TMPRSS2) and several lysosomal proteases cleave and activate the S-glycoprotein due to SARS-CoV-2 entry into the cell through endocytosis or direct membrane fusion with the host membrane (Vlachakis *et al.*, 2020). sACE2 is cleaved from ACE2 by a disintegrin and metallopeptidase domain-17 (ADAM17) and then released into the extracellular environment (Lambert *et al.*, 2005).

SARS-CoV-2 may cause an overzealous immune-inflammatory response and even a cytokine storm in the host associated with severe lung pathology (Hui and Zumla, 2019, Huang *et al.*, 2020a). These processes are closely linked to poor clinical outcomes (Huang *et al.*, 2020b, Qin *et al.*, 2020), worsening of hypercoagulation (Mehta *et al.*, 2020), and higher mortality (Wu *et al.*, 2020). For example, the severity of COVID-19 infection is associated with increased interleukin-6 (IL-6) and other proinflammatory cytokines, C-reactive protein (CRP), and IL-10, a negative immune-regulatory cytokine (Ruan *et al.*, 2020, Wu *et al.*, 2020). Mitigation of the cytokine storm may contribute to better clinical outcomes in severe cases of COVID-19. (Ye *et al.*, 2020). Severe COVID-19 is also accompanied by lowered serum albumin levels or hypoalbuminemia as part of the systemic inflammatory response in patients with COVID-19 (Huang *et al.*, 2020c) (Zhang *et*

*al.*, 2020c, Zhou *et al.*, 2020b). Hypoalbuminemia frequently occurs in inflammatory diseases because the liver production of albumin is downregulated by pro-inflammatory cytokines, including IL-6 (Maes, 1993), and because capillary permeability is enhanced leads to leakage of albumin to the interstitial space (Soeters *et al.*, 2019).

Another possible candidate biomarker of COVID-19 is a soluble form of the advanced glycation end-product receptor (sRAGE) (Yalcin Kehribar *et al.*, 2021). Advanced glycation end products (AGEs) and high mobility group box 1 protein (HMGB1) can bind to the membrane-bound RAGE (mRAGE), thereby initiating intracellular signaling (Vistoli *et al.*, 2013), which leads to activation of pro-inflammatory transcription factors, including nuclear factor (NF)-kappa B (Macaione *et al.*, 2007, Julio *et al.*, 2014), which in turn increased the production of, for example, IL-6 protein transcription in immune cells (Wang and Liu, 2016). sRAGE is generated through proteolytic cleavage of the RAGE extracellular domain or through alternative RNA splicing (Zhang *et al.*, 2008b, Sterenczak *et al.*, 2009).

Several studies have documented a high prevalence of hypocalcemia in COVID-19 patients (Cappellini *et al.*, 2020, Lippi *et al.*, 2020), and one study found that hypocalcemia could predict hospitalization in COVID-19 patients (Di Filippo *et al.*, 2020). Alterations of Ca<sup>2+</sup> homeostasis may occur during viral infections (Nieto-Torres *et al.*, 2015) (Deng *et al.*, 2012) because viruses often utilize Ca<sup>2+</sup> signals to create a suitable cellular environment that meets their demands (Zhou *et al.*, 2009). Lowered levels of calcium may interfere with calcium-regulated processes, including signal transduction networks, which are regulated by calcium's activities as a second messenger or as plasma membrane channels and pumps (Civitelli and Ziambaras, 2011, Görlach *et al.*, 2015). Magnesium deficiency is significantly and inversely related to the severity of infection in COVID-19 patients (Quilliot *et al.*, 2020). Magnesium shows anti-inflammatory (Abiri and Vafa, 2020)

and antioxidant (Güzel *et al.*, 2019) properties and is an important cofactor for ATP, which mediates several basic enzymatic reactions (Romani and Scarpa, 1992). Nevertheless, no studies in SARS-CoV-2-infected patients with COVID-19 have examined whether a combination of the above biomarkers may be used to externally validate the diagnosis of COVID-19 and whether these pathways are associated with the presence of lowered SpO<sub>2</sub>.

Hence, the present study aimed to examine the levels of ACE2, sRAGE, IL-6, IL-10, albumin, calcium, and magnesium in patients with COVID-19 versus normal controls and to examine the association between those biomarkers and SpO<sub>2</sub> levels and CCTAS. The specific hypotheses are that a) COVID-19 is associated with increased ACE2, sRAGE, IL-6, IL-10 levels, and lowered albumin, calcium, and magnesium; and b) that those biomarkers are associated with lowered SpO<sub>2</sub>.

## **Subjects and Methods**

### **Subjects**

Sixty COVID-19 male patients aged 25-59 years were recruited at the Al-Sadr Teaching Hospital and Al-Amal Specialized Hospital for Communicable Diseases in Najaf governorate-Iraq between September and November 2020. All patients were admitted to these two centers, which are official quarantine centers specialized in the treatment of COVID-19. The diagnosis was made by senior physicians and virologists. All patients suffered from acute respiratory syndrome and were diagnosed with SARS-CoV-2 infection according to positive results of COVID-19 nucleic acids by reverse transcription real-time polymerase chain reaction (rRT-PCR), positive IgM, in addition to the standard symptoms of the disease including fever, breathing difficulties, cough, and loss of smell and taste. We excluded patients with premorbid medical illnesses, including diabetes



type 1, liver, kidney and cardiovascular diseases. We also recruited 30 healthy controls, age, and sex-matched to the patient groups. All controls were free from any systemic disease. However, to enhance their immunity against COVID-19 infection, some healthy controls were taken zinc and vitamins C and D.

The “institutional ethics board of the University of Kufa” approved the study (617/2020). All participants gave written informed consent before participation in this study. The study was conducted according to Iraq and international ethics and privacy laws and was conducted ethically in accordance with the World Medical Association Declaration of Helsinki. Furthermore, our IRB follows the International Guideline for Human Research protection as required by the Declaration of Helsinki, The Belmont Report, CIOMS Guideline and International Conference on Harmonization in Good Clinical Practice (ICH-GCP).

### *Measurements*

The RT-PCR tests were performed using the Applied Biosystems® QuantStudio™ 5 Real-Time PCR System (Thermo Fisher Scientific) supplied by Life Technologies Holdings Pte Ltd., Marsiling Industrial Estate, Singapore. The Lyra® Direct SARS-CoV-2 Assay kits were supplied by Quidel Corporation, CA, USA. The procedures were exactly followed as mentioned by the manual of the kits. This is a real-time RT-PCR assay for the qualitative detection of human coronavirus SARS-CoV-2 from viral RNA extracted from nasal, nasopharyngeal or oropharyngeal swab specimens. The Assay targets the non-structural Polyprotein (pp1ab) of the SARS-CoV-2 virus. Patients had a chest X-ray and chest computed tomography scan (CT-scan) to search for lung abnormalities. CT-scans were made by using SOMATOM Definition AS, Supplied by Seimens, Munchen, Germany. The chest CT abnormalities (CCTAs) assessed in our study

comprise GGOs, areas of pulmonary densification consistent with residual lesions, pneumonic consolidation, and crazy-paving patterns (Kwee and Kwee, 2020). The total CCTA score was computed using the international standard nomenclature (Hansell et al., 2008; Franquet, 2011). Accordingly, the patients' group was subdivided into two subgroups depending on the presence of CCTAs into those with (COVID9+CCTA) and without (COVID-CCTA).

The blood samples were taken in the early morning between 7.30-9.00 a.m. after awakening and before having breakfast. Five milliliters of venous blood samples were drawn and transferred into clean plain tubes. Hemolyzed samples were rejected. After ten minutes, the clotted blood samples were centrifuged for five minutes at 3000 rpm and then serum was separated and transported into three new Eppendorf tubes until assay. A qualitative ACON<sup>®</sup> COVID-19 IgG/IgM rapid test was used to detect IgG and IgM in the sera of patients and controls. The kits have a sensitivity  $\geq 99.1\%$  and a specificity  $\geq 98.2\%$ . We also divided the patient's subgroups according to IgG results into negative-IgG and positive-IgG subgroups to examine the difference in the measured biomarkers between these subgroups. A C-Reactive Protein (CRP) latex slide test (Spinreact<sup>®</sup>, Barcelona, Spain) was used for the qualitative and semi-quantitative CRP measurement in human serum. The serum titer is the reciprocal of the maximum dilution exhibiting a positive response multiplied by a positive control concentration. The approximate CRP concentration in the patient sample is calculated as follows:  $6 \times \text{CRP Titer} = \text{mg/L}$ . Serum IL-6, IL-10, sRAGE, and sACE2 were measured using ELISA kits supplied by Melsin Medical Co, Jilin, China. All kits were based on a sandwich technique and showed an inter-assay CV of less than 12%. Total calcium, albumin, and magnesium were measured spectrophotometrically by kits supplied by Biolabo<sup>®</sup>, Maizy, France. The procedures were followed according to the manufacturer's instructions and without modifications.

## Statistical analysis

Analysis of variance (ANOVA) was used to check differences in scale variables among groups, and analysis of contingency tables ( $\chi^2$ -test) was used to assess associations between nominal variables. We computed correlation matrices based on Pearson's product-moment correlation coefficients to determine correlations between biomarkers and clinical scores (e.g., duration of illness and SpO<sub>2</sub>). We used univariate generalized linear model (GLM) analysis to delineate the associations between diagnosis and the biomarkers while controlling for confounding variables, including tobacco use disorder (TUD), age, and BMI. The effect size was estimated using partial eta-squared values. We also computed model generated (GLM analysis) estimated marginal mean (SE) values and protected pairwise comparisons among treatment means. Multiple comparisons were evaluated using false discovery rate p-correction (Benjamini and Hochberg, 1995). Tests were 2-tailed, and a p-value of 0.05 was used for statistical significance.

Multilayer perceptron Neural Network models were employed to assess the more complex associations between the diagnosis of COVID-19 *versus* controls (entered as output variables) and biomarkers (entered as input variables). We trained the models with an automated feed-forward architecture, two hidden layers with up to 4 nodes in each layer, with minibatch training with gradient descent, and 20-50 epochs. The stopping rule was one consecutive step with no further decrease in the error term. Three samples were extracted, namely “a training sample to estimate the network parameters (46.67% of all participants), testing set to prevent overtraining (20.0%) and a holdout set to evaluate the final network (33.33%). Error, relative error, and importance and relative importance of all input variables were computed” (Moustafa *et al.*, 2020). All statistical analyses were performed using IBM SPSS windows version 25, 2017.

## Results

### *Socio-demographic data*

**Table 1** demonstrates the socio-demographic data in COVID+CCTA and COVID-CTTA patients, and healthy controls (HC). No significant differences among these study groups were detected in BMI, education, residency, marital status, employment, and TUD. CCTA+ patients were somewhat older than CCTA- patients, but illness duration was not significantly different between those groups. All patients were on O<sub>2</sub> therapy and were treated with paracetamol, bromhexine, vitamin C, vitamin D, and zinc as a continuous treatment. There were no significant differences in the use of azithromycin, enoxaparin, dexamethasone, famotidine, heparin, and meropenem between CCTA+ and CCTA- patients.

### *Differences in biomarkers between CCTA+ and CCTA- patients*

**Table 2** shows the different biomarkers' measurements in the three study groups with significant differences in all biomarkers, which remained significant after p-correction for FDR. There was a significant decrease in SpO<sub>2</sub> and serum albumin in CCTA+ patients compared to CCTA- patients. The serum levels of IL-6, IL-10, sRAGE, sACE2, and CRP were higher in COVID-19 patients compared with controls. SpO<sub>2</sub>, serum albumin, calcium, and magnesium were lowered in both patient groups compared to controls, while there were no significant differences in those biomarkers between both patients' subgroups.

### *Neural network results*

We have performed neural network analyses with diagnosis (COVID-19 *versus* controls) as output variables and the biomarkers as explanatory variables and reran the analyses with the 4 most important biomarkers, i.e., calcium, IL-6, CRP, and sRAGE. **Table 3** shows the network information of the model examining the separation of COVID-19 *versus* controls. The network has been trained using two hidden layers with three and two units in layers 1 and 2. Hyperbolic tangent was used as the activation function in hidden layer 1 and identity in the output layer. **Table 3** displays the partitioned confusion matrices showing an AUC ROC=1.000 with an accuracy of 100.0% in the holdout sample with a sensitivity of 100.0% and a specificity of 100.0%. **Figure 1** shows the relative importance of the most important input variables (Ca > IL-6 > CRP > sRAGE), representing the most important determinants of the predictive power of the model.

#### *Biomarkers results in COVID-19 subgroups with and without anti-SARS-CoV-2 IgG antibodies*

The univariate GLM analysis of the biomarkers in patients' subgroups (positive versus negative anti-SARS-CoV-2 IgG antibodies) showed significant elevations in serum IL-6, sRAGE, and ACE2 in patients with positive IgG results as compared with the IgG negative patient subgroup. These differences remained significant after performing p-correction for FDR, even IL-6 ( $p=0.042$ ). Other biomarkers showed no significant differences between those subgroups.

#### *Intercorrelation matrix*

**Table 5** shows the intercorrelation matrix of the biomarkers and duration of the infection and SpO<sub>2</sub> levels. Duration of illness was inversely associated with SpO<sub>2</sub>, albumin, magnesium, and calcium. These p-values remained significant after FDR correction (all at  $p<0.003$ ). The results showed that SpO<sub>2</sub> was significantly and negatively correlated with duration of illness, CRP, IL-6,

IL-10, sRAGE, and ACE2, and significantly and positively with albumin, magnesium, and calcium. There were no significant associations between the biomarkers and the total CCTA score.

## Discussion

The first major finding of this study is that COVID-19 is accompanied by increased IL-6, IL-10, and CRP in addition to sRAGE and ACE2 and that albumin, calcium and magnesium are significantly decreased as compared with controls. Moreover, a combination of calcium, IL-6, CRP and sRAGE was able to validate the diagnosis of COVID-19 with 100% accuracy. Duration of infection was accompanied by lowered SpO<sub>2</sub>, albumin, calcium and magnesium levels.

### *Inflammation and COVID-19*

The pathophysiology of COVID-19 involves a potent immune-inflammatory response, including increases in IL-6 and IL-10, which is associated with a higher risk of disease deterioration (Han *et al.*, 2020). When the immune system is activated following infection with SARS-CoV-2, an overzealous immune system may secrete many proinflammatory cytokines, and may cause a cytokine storm (Kuba *et al.*, 2010, Jia, 2016), which is a key component in the pathophysiology of severe COVID-19 (Tetro, 2020, Yang *et al.*, 2020) (Huang *et al.*, 2020a, Li *et al.*, 2020a). Sustained elevations in pro-inflammatory cytokines in COVID-19 patients indicate continuing systemic and tissue inflammation (Chen *et al.*, 2020, Guan *et al.*, 2020a, Wang *et al.*, 2020). It is interesting to note that the combination of IL-6 coupled with D-dimer may be used to differentiate extreme COVID-19 cases (Gao *et al.*, 2020).

Increased CRP levels have been associated with the cytokine storm and liver damage in COVID-19 patients and generally contribute to a worse prognosis (Li *et al.*, 2020b). The hypoalbuminemia in our COVID-19 patients may, at least in part, be explained by the acute-phase

response downregulating negative acute-phase proteins, although increased vascular permeability and liver or kidney disease may play a role (Ronit *et al.*, 2020). Albumin has strong antioxidant properties (Maes *et al.*, 2011), and as such, hypoalbuminemia may play a role in the exaggerated immune responses in COVID-19. Moreover, albumin has anticoagulant and antiplatelet activities, and therefore hypoalbuminemia may be associated with hypercoagulability (Paar *et al.*, 2017), increased D-dimers, a thrombin generation marker (Thachil *et al.*, 2020), and enhanced risk of artery and venous thrombosis (Ronit *et al.*, 2020). It is important to note that coagulopathies complicate the clinical course of COVID-19 (Thachil *et al.*, 2020) (Huang *et al.*, 2020c) and that, therefore, hypoalbuminemia may play a role in COVID-19 associated coagulopathies.

#### *ACE2 and COVID-19*

As described in the Introduction, only a few studies reported increased ACE2 levels in patients with SARS-CoV-2 infection and COVID-19 (Nagy *et al.*, 2021, Patel *et al.*, 2021). ACE2 concentrations are strongly related to ACE2 catalytic activity (Zhang *et al.*, 2018). Increased ACE2 plasma levels are associated with an increased risk of stroke, myocardial infarction, incident diabetes, incident heart failure and, as a consequence, with total cardiovascular and non-cardiovascular deaths (Narula *et al.*, 2020). In patients with heart failure, increased plasma ACE2 activity is associated with a worsened prognosis (Oudit and Pfeffer, 2020). The most important determinants of increased ACE2 values are male sex, geographic ancestry, and body-mass index (BMI) (Narula *et al.*, 2020). In physiological conditions, cell-bound membrane ACE2 is a counter-regulatory pathway through the production of angiotensin-(1-7) and stimulation of the angiotensin 2 (AT2R) and Mas receptors, which promote anti-inflammatory and antioxidant processes, vasorelaxation, anti-fibrosis, and attenuate the renin-angiotensin system, cellular proliferation,

hypertrophy, and vasoconstriction (Narula *et al.*, 2020). Nevertheless, the extracellular domain of the transmembrane ACE2 facilitates entry for SARS-CoV-2 into the cells via interactions with the SARS-CoV spike protein (Walls *et al.*, 2020, Zhou *et al.*, 2020a). This process is followed by downregulation of surface ACE2 expression that may culminate in loss of angiotensin II effects leading to increased multisystem diseases, including lung, cardiovascular and renal disease (Oudit and Pfeffer, 2020). Moreover, the downregulation of ACE2 expression through the SARS-CoV spike protein causes shedding of soluble ACE, which is therefore a consequence of SARS-CoV infection (Glowacka *et al.*, 2010). It is hypothesized that increased sACE2 shedding may neutralize the SARS-CoV2 virus at a distance from virus entry into the cells (Brest *et al.*, 2021). All in all, COVID-19 infection may cause part of its detrimental effect via renin-angiotensin system overactivation and increased levels of sACE2.

#### *sRAGE and COVID-19*

As described in the Introduction, increased levels of plasma sRAGE were reported previously (Yalcin Kehribar *et al.*, 2021). In another study, sRAGE was significantly increased in COVID-19 patients with diabetes mellitus versus normal controls (Dozio *et al.*, 2020a). Nevertheless, in our study, patients with diabetes mellitus were excluded indicating that the increased sRAGE concentrations in COVID-19 are not due to diabetes mellitus. These findings extend those of Dozio *et al.* (2020) who reported that in COVID-19 patients, the RAGE pathway may be modulated regardless of glycemic control (Dozio *et al.*, 2020b). It is important to note that increased sRAGE in bronchoalveolar lavage and plasma indicates acute pulmonary injury and type 1 alveolar epithelial cell injury (Uchida *et al.*, 2006). Nevertheless, in our study, sRAGE levels were not significantly increased in COVID-19 patients with CCTA than those without CCTA.



sRAGE may function as a decoy receptor, which prevents binding of ligands to mRAGE, thereby negatively regulating immune-inflammatory responses (Yang *et al.*, 2014, Oczypok *et al.*, 2017), as observed during acute lung injury (Zhang *et al.*, 2008a), the acute respiratory distress syndrome (ARDS) (Izushi *et al.*, 2016), neutrophilic asthma, and COPD (Sukkar *et al.*, 2012). In some diseases, administration of sRAGE may attenuate immune-inflammatory responses (Ekong *et al.*, 2006, van Zoelen *et al.*, 2011, Zhang *et al.*, 2017).

### *Calcium, magnesium and COVID-19*

In our study, the most important biomarker of COVID-19 was lowered calcium. Low calcium is common in severe COVID-19 patients and is associated with the severity of illness (Sun *et al.*, 2020), and lowered calcium levels may detect the most critical COVID-19 patients with high specificity (Yang *et al.*, 2021). However, hypocalcemia is also detectable in COVID-19 patients with non-severe illness (Pal *et al.*, 2020). In addition, patients with very low calcium values have an increased prevalence of acute respiratory distress syndrome (ARDS) (Sun *et al.*, 2020). Interestingly, inflammation appears to be higher in COVID-19 patients with extremely low blood calcium levels compared to patients with normal calcium levels (Di Filippo *et al.*, 2020, di Filippo *et al.*, 2021). This is not an invariant finding, however, as hypocalcaemia is sometimes detectable in COVID-19 patients with non-severe illness rather arguing against inflammation as a universal cause of the phenomenon (Pal *et al.*, 2020). Hypocalcemia causes an increased secretion of PTH, hypoproteinemia, hypomagnesemia (Kelly and Levine, 2013) and more detrimental effects as described in the Introduction.

SARS-CoV and MERS-CoV are known to disrupt intracellular calcium homeostasis to foster membrane fusion and increase infectivity (Millet and Whittaker, 2018, Straus *et al.*, 2019)

and the hypocalcemia seen in patients with severe COVID-19 is also evident in patients following SARS-CoV infection (Booth, 2003). This suggests that there may be a common mechanism driving the development of calcium dyshomeostasis following beta coronavirus infections. Several mechanisms are involved in calcium dyshomeostasis mediated by a plethora of viruses following cell invasion including activation of  $\text{Ca}^{2+}$  ATPase pumps, the transient receptor potential canonical (TRPC) channels with the receptor-operated  $\text{Ca}^{2+}$  currents (ROCs), and the store-operated calcium entry (SOCE) channels (Chen *et al.*, 2019). The latter may be of particular interest as one potential mechanism explaining beta coronavirus-mediated calcium dyshomeostasis is that SOCE may be activated by endoplasmic-reticulum (ER) stress (Chen *et al.*, 2015, Zhang *et al.*, 2020b), which is an invariant consequence of the replication strategies employed by these viruses (Fung and Liu, 2014, Morris *et al.*, 2020a). The plausibility of SOCE activation as a vehicle to explain SARS-CoV2 mediated decreases in plasma calcium levels is increased by the presence of *in vivo* data confirming that SARS-CoV ORF8 and ORF3 have the capacity to activate SOCE (Hyser and Estes, 2015). Importantly, SOCE is activated in conditions of inflammation and oxidative stress (Nunes and Demareux, 2014), which is characteristic of SARS-CoV-2 infection (Morris *et al.*, 2020b). SOCE activation also upregulates nuclear factor- $\text{KB}$  potentially resulting in a positive feedback mechanism amplifying inflammation, oxidative stress and calcium dyshomeostasis (Berry *et al.*, 2018, Dresselhaus and Meffert, 2019).

Lowered serum magnesium is associated with increased thrombosis risk, decreased fibrinolysis, endothelial dysfunction, mitochondrial dysfunctions, increased inflammatory and oxidative stress, and increased fatty acid production (Çiçek *et al.*, 2016, Zheltova *et al.*, 2016, Gromova *et al.*, 2018, Nielsen, 2018). Furthermore, *in vivo* studies have demonstrated that

magnesium has antithrombotic properties and decreases mortality in induced pulmonary thromboembolism (Sheu *et al.*, 2003).

### *CCTA and consequences*

The second major finding of the present study is that CCTAs are accompanied by lowered albumin and SpO<sub>2</sub> levels and that the latter is associated with all biomarkers described above. Chest imaging, especially by computed tomography scan (CT-scan), is of great importance for the diagnosis, management, and follow-up of patients with COVID-19 infection (Fang, 2020, Zhang *et al.*, 2020a). For example, the appearance of GGOs in COVID-19 indicates severe or persistent inflammation in the lungs, and more severe symptoms including bronchiolitis and pneumonia in both lungs, and lung fibrosis (Sadhukhan *et al.*, 2020). These lung infection sites may cause the recruitment of various immune cells, and consequently, a pro-inflammatory response is mounted, including increased levels of IL-6 (Sadhukhan *et al.*, 2020). Our results also indicate that lung lesions as detected with chest-CT scan may lead to decreased oxygenation. In fact, many of the patients included here (88.3%) showed hypoxemia as indicated by SpO<sub>2</sub> < 92%. Moreover, hypoxia may induce inflammation (Eltzschig *et al.*, 2014) and may upregulate ACE2 gene expression and protein levels in lung and kidney tissues, which may further contribute to the severity of COVID-19 (Shenoy *et al.*, 2020). There are also reports that patients with higher GGO CT-scores have lower calcium levels and that SPO<sub>2</sub> is correlated with serum calcium with those COVID-19 patients staying longer in ICU (Yang *et al.*, 2021).

### *Biomarkers and IgG positivity*

Another important result of our study is that patients with positive IgG results showed higher IL-6, sRAGE and ACE2 levels as compared to those with negative IgG results. In our study, 66.7% of the COVID-19 patients showed IgG positivity which is in agreement with previous studies showing that around 77.9% of plasma samples were IgG positive (Guo *et al.*, 2020b). Following exposure to the SARS-CoV-2 infection, a humoral immune response is mounted which starts with IgM formation after 3-7 days, indicating an acute or continuing infection and those levels peak after three weeks (Xiao *et al.*, 2020). Increased IgG levels may be detected 14 days after symptom onset (Guo *et al.*, 2020a). In fact, the antibody dynamics in COVID-19 are quite similar to those in other viral infections, with IgG levels increasing when IgM levels start to decrease (Zhou *et al.*, 2020c). It is well known that IL-6 may drive IgG formation by B-cells (Maeda *et al.*, 2010). Increased IgG titers are more prevalent in severe than in mild clinical status, especially in female patients (Zeng *et al.*). As such, the association between positive IgG titers and ACE2 and sRAGE could be explained by the increased severity of illness.

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## Conflict of interest

The authors have no conflict of interest with any commercial or other association connected with the submitted article.

## Author's contributions

HAJ recruited the patients and collected blood samples. HAJ and HAH measured the serum biomarkers. MM performed the statistical analysis. All authors collaborated in the analysis design, the discussion of the findings, the drafting and editing of the manuscript, and the final version of the manuscript.

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Table 1. Socio-demographic and clinical data of COVID-19 patients divided into those with (COVID+CCTA) and without (COVID-CCTA) chest CT scan abnormalities, and healthy controls (HC).

Variables	HC (n=30)	COVID-CCTA (n=13)	COVID+CCTA (n=47)	F/FEPT/ $\chi^2$	df	p
Age (years)	47.1±5.2	42.92±10.1 <sup>B</sup>	50.1±7.4 <sup>C</sup>	5.47	2/87	0.006
BMI (kg/m <sup>2</sup> )	28.1±2.2	29.8±5.8	27.8±4.5	1.32	2/87	0.273
Education, years	11.3±4.5	12.5±3.43	10.9±3.6	0.84	2/87	0.436
Duration of illness (months)	14.5±6.5	14.3±4.7	14.4±5.0	0.02	1/58	0.891
Urban/Rural	27/3	10/3	33/14	4.16	2	0.125
Single/married	28/2	11/2	43/4	0.87	2	0.648
TUD (No/Yes)	10/20	5/8	16/31	0.11	2	0.945
Employment (No/Yes)	8/22	8/5	9/38	FEPT	-	<0.001
Zinc (No/Yes)	16/14	0/13	0/47	FEPT	-	<0.001
Vitamin D (No/Yes)	25/5	0/13	0/47	FEPT	-	<0.001
Vitamin C (No/Yes)	16/14	0/13	0/47	FEPT	-	<0.001
Dexamethasone (No/Yes)	-	3/10	6/41	0.85	1	0.357
Famotidine (No/Yes)	-	1/12	22/25	FEPT	-	0.011
Azithromycin (No/Yes)	-	5/8	20/27	0.07	1	0.791
Meropenem (No/Yes)	-	8/5	27/20	0.07	1	0.791
Heparin (No/Yes)	-	5/8	20/27	0.07	1	0.791
Enoxaparin (No/Yes)	-	8/5	27/20	0.07	1	0.791
O2 therapy (No/Yes)	-	0/13	0/47	-	-	-
Bromhexine (No/Yes)	-	0/13	0/47	-	-	-
Paracetamol (N/Yes)	-	0/13	0/47	-	-	-

All results are shown as mean (SD). FEPT: Fisher's exact probability test. BMI: body mass index, TUD: tobacco use disorder.

Table 2. Biomarkers in COVID-19 patients divided into those with (COVID+CCTA) and without (COVID-CCTA) chest CT scan abnormalities, and healthy controls (HC).

<b>Biomarkers</b>	<b>HC (n=30)</b>	<b>COVID-CCTA (n=17)</b>	<b>COVID+CCTA (n=43)</b>	<b>F</b>	<b>p</b>	<b>Partial <math>\eta^2</math></b>
SPO <sub>2</sub>	97.1 ±1.4 <sup>B, C</sup>	81.9 ±12.5 <sup>A, C</sup>	69.8 ±12.2 <sup>A, B</sup>	64.97	<0.001	0.607
IL-6      pg/ml	9.5 ±3.2 <sup>B, C</sup>	14.7 ±2.6 <sup>A</sup>	14.7 ±3.5 <sup>A</sup>	26.94	<0.001	0.391
CRP      mg/dL	2.5 ±0.0 <sup>B, C</sup>	5.3 ±3.4 <sup>A</sup>	7.9±5.3 <sup>A</sup>	25.45	<0.001	0.377
Albumin    g/l	44.8 ±5.0 <sup>B, C</sup>	38.7 ±6.8 <sup>A, C</sup>	33.5±5.6 <sup>A, B</sup>	34.60	<0.001	0.452
IL-10      pg/ml	5.5±4.3 <sup>B, C</sup>	14.6±5.5 <sup>A</sup>	14.6±4.9 <sup>A</sup>	55.90	<0.001	0.571
sRAGE      pg/ml	456.2 ±232.0 <sup>B, C</sup>	967.6±202.0 <sup>A</sup>	928.3±202.6 <sup>A</sup>	69.23	<0.001	0.622
sACE2      ng/ml	2.71 ±1.34 <sup>B, C</sup>	4.19 ±1.24 <sup>A</sup>	4.05±1.19 <sup>A</sup>	11.71	<0.001	0.218
Magnesium   mM	0.76 ±0.15 <sup>B, C</sup>	0.64±0.08 <sup>A</sup>	0.64±0.15 <sup>A</sup>	6.92	0.002	0.142
Calcium      mM	2.50±0.22 <sup>B, C</sup>	2.00±0.16 <sup>A</sup>	1.89±0.28 <sup>A</sup>	55.93	<0.001	0.571

All results are shown as mean (SE). All results of univariate GLM analyses examining the associations between diagnosis (healthy control and COVID-19 patients divided into two groups and after adjusting for age, tobacco use disorder, and body mass index; all df=2/84.

IL: interleukin, CRP: C-reactive protein, sRAGE: soluble receptor for advanced glycation end products, sACE2: soluble Angiotensin-converting enzyme 2, SPO<sub>2</sub> %: peripheral oxygen saturation percentage.

Table 3. Results of neural networks with diagnosis with COVID-19 patients versus healthy controls (HC) as output variables and biomarkers as input variables.

	<b>Model</b>	<b>COVID-19 vs. HC</b>
Input Layer	Number of units	4
	Rescaling method	Normalized
Hidden layers	Number of hidden layers	2
	Number of units in hidden layer 1	3
	Number of units in hidden layer 2	2
	Activation Function	Hyperbolic tangent
Output layer	Dependent variables	COVID-19 vs. HC
	Number of units	2
	Activation function	Identity
	Error function	Sum of squares
Training	Sum of squares error term	0.056
	% incorrect or relative error	0.0%
	Prediction (sens, spec)	100%, 100%
Testing	Sum of Squares error	0.303
	%incorrect or relative error	0.0%
	Prediction (sens spec)	100%, 100%
	AUC ROC	1.00
Holdout	%incorrect or relative error	0.0%
	Prediction (sens, spec)	100%, 100%

AUC ROC: area under curve of receiver operating curve, sens: sensitivity, spec: specificity.

Table 4. Differences in biomarkers between COVID-19 patients with and without anti-SARS-CoV-2 IgG antibodies

Parameter	Negative IgG N=20	Positive IgG N=40	F	df	p	Partial $\eta^2$
SPO <sub>2</sub> %	69.8 ±2.9	73.8 ±2.1	1.26	1	0.266	0.021
IL-6 pg/ml	13.3 ±0.7	15.4 ± 0.5	6.47	1	0.014	0.100
CRP mg/dL	6.8 ± 1.1	7.6 ±0.8	0.01	1	0.909	<0.001
Albumin g/l	34.2 ± 1.4	34.9 ±1.0	0.15	1	0.705	0.002
IL-10 pg/ml	13.6 ± 1.1	15.0 ±0.8	1.72	1	0.194	0.029
sRAGE pg/ml	833.2 ±42.3	988.6 ±29.9	10.55	1	0.002	0.154
sACE2 ng/ml	3.28 ±0.24	4.48 ±0.17	17.12	1	<0.001	0.228
Magnesium mM	0.66 ± 0.03	0.62 ±0.02	1.08	1	0.303	0.018
Calcium mM	1.87 ±0.05	1.93 ±0.04	0.59	1	0.446	0.010

All results of univariate GLM analysis; results are shown as mean ±SE. IL: interleukin, CRP: C-reactive protein, sRAGE: soluble receptor for advanced glycation end products, sACE2: soluble angiotensin-converting enzyme 2, SPO<sub>2</sub> %: peripheral oxygen saturation percentage.



Table 5. Intercorrelation matrix between biomarkers and duration of COVID-19 infection and peripheral oxygen saturation (SpO<sub>2</sub>)

Parameter	Duration of infection	SpO <sub>2</sub>
Duration of Disease	-	-0.410 (0.001)
SPO <sub>2</sub>	-0.410 (0.001)	-
IL-6	0.007 (0.958)	-0.444 (<0.001)
CRP	0.152 (0.248)	-0.638 (<0.001)
IL-10	-0.051 (0.699)	-0.492 (<0.001)
sRAGE	0.097 (0.461)	-0.461 (<0.001)
sACE2	0.106 (0.419)	-0.247 (0.019)
Albumin	-0.515 (<0.001)	0.696 (<0.001)
Magnesium	-0.333 (0.009)	0.469 (<0.001)
Calcium	-0.405 (0.001)	0.745 (<0.001)

Shown are Pearson's product moment correlation coefficients (p-value). IL: interleukin, CRP: C-reactive protein, sRAGE: soluble receptor for advanced glycation end products, sACE2: soluble angiotensin-converting enzyme 2, SPO<sub>2</sub> %: peripheral oxygen saturation percentage.

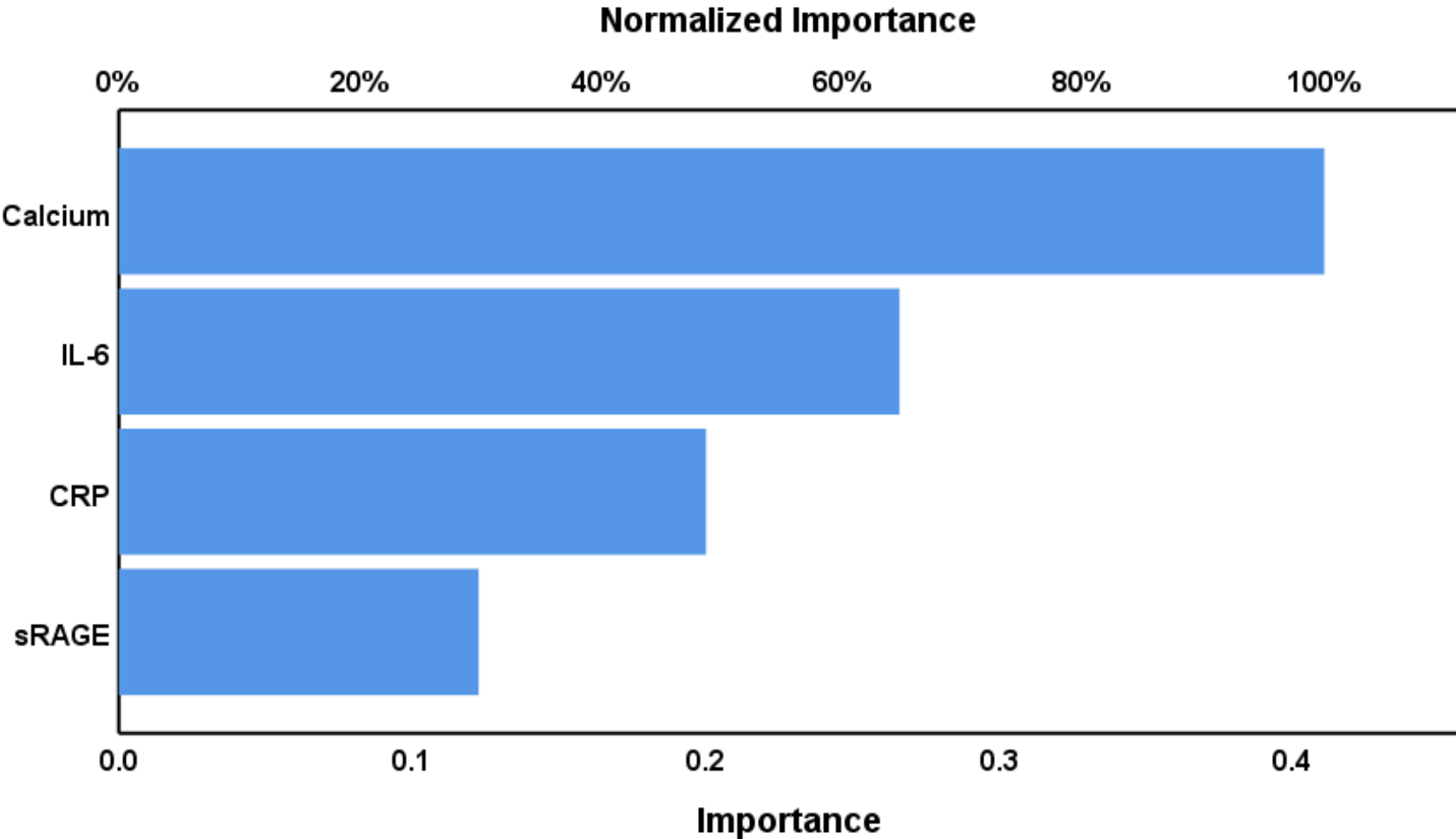


Figure 1. Results of neural network (importance chart) with diagnosis of COVID-19 as output variables and biomarkers (in z-scores) as input variables. IL-6: interleukin-6, CRP: C-reactive protein, sRAGE: soluble receptor for advanced glycation end product.