

# **Serum Vitamin D levels are associated with increased COVID-19 severity and mortality independent of whole-body and visceral adiposity**

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## **ABSTRACT (229 WORDS)**

**INTRODUCTION:** Coronavirus disease (COVID-19) is a global pandemic. Vitamin D deficiency has been associated with susceptibility to infectious disease. In this study, the association between COVID-19 outcomes and vitamin D levels in patients attending a COVID-19 reference center in Mexico City are examined.

**METHODS:** Consecutive patients with confirmed COVID-19 were evaluated. All patients underwent clinical evaluation and follow-up, laboratory measurements and a thoracic computerized tomography, including the measurement of epicardial fat thickness. Low vitamin D was defined as levels <20ng/mL (<50nmol/L) and deficient Vitamin D as a level  $\leq$ 12ng/mL (<30nmol/L)

**RESULTS:** Of the 551 patients included, low vitamin D levels were present in 45.6% and deficient levels in 10.9%. Deficient Vitamin D levels were associated with mortality (HR 2.11, 95%CI 1.24-3.58,  $p=0.006$ ) but not with critical COVID-19, adjusted for age, sex, body-mass index and epicardial fat. Using model-based causal mediation analyses the increased risk of COVID-19 mortality conferred by low vitamin D levels was partly mediated by its effect on D-dimer and cardiac ultrasensitive troponins. Notably, increased risk of COVID-19 mortality conferred by low vitamin D levels was independent of BMI and epicardial fat.

**CONCLUSION:** Vitamin D deficiency ( $\leq$ 12ng/mL or <30nmol/L), is independently associated with COVID-19 mortality after adjustment for visceral fat (epicardial fat thickness). Low vitamin D may contribute to a pro-inflammatory and pro-thrombotic state, increasing the risk for adverse COVID-19 outcomes.

**Keywords:** Vitamin D, COVID-19, SARS-CoV-2, Adiposity, Severe disease

## INTRODUCTION

Coronavirus Disease (COVID-19), caused by the novel coronavirus severe acute respiratory syndrome coronavirus 2 (SARS-CoV-2), has caused significant burden in healthcare systems world-wide. In Mexico, COVID-19 has caused a large number of deaths, primarily due to the large prevalence of cardio-metabolic diseases linked to adverse outcomes and additionally due to the impact of socio-demographic factors which impact healthcare access and quality of care across Mexico(1–4). SARS-CoV-2 spreads primarily by close contact with respiratory droplets from infected individuals and contaminated surfaces(5,6). SARS-CoV-2 infects cells using the angiotensin converting enzyme-2 (ACE-2) receptor; infection can produce an interstitial pneumonia that may progress to acute respiratory distress syndrome (ARDS) and death(7,8). COVID-19 severity has been shown to be modified by the presence of cardio-metabolic comorbidities as well as inflammatory markers which may reflect vascular or respiratory deterioration(9–12).

Vitamin D is a steroid hormone involved in essential physiological roles including preserving bone integrity, immunomodulation by stimulating innate immunity and tempering adaptive immunity, infectious disease prevention and cardiovascular health(13,14). It also acts on the renin angiotensin aldosterone (RAAS) system, inhibiting the angiotensin converting enzyme (ACE(7)). Several factors are known to influence vitamin D levels; lower levels are associated with ethnicity, variation in sun exposure due to higher latitudes, season, time of day, clothing, sunscreen use and skin pigmentation, age, lower sun exposure, obesity and chronic illnesses(15). Low levels of vitamin D have been associated with increased susceptibility to infectious disease, particularly respiratory tract infections. Several studies have explored the relationship between COVID-19 and vitamin D levels(16,17); however, concerns regarding residual confounding and the lack of mechanistic interpretations for the association of low Vitamin D levels with adverse COVID-19 outcomes requires further

studies. Overall, pooled evidence suggests that high Vitamin D levels have been associated with reduced risk of adverse COVID-19 outcomes, which may suggest a beneficial role for Vitamin D in COVID-19(18). Nevertheless, evidence from randomized controlled trials have not shown benefit from Vitamin D supplementation in COVID-19 or other infections due to the high heterogeneity across studies and its systematic use requires further evaluation(19,20).

The presence of obesity results in decreased bioavailability of vitamin D, which is probably related to sequestration into adipose tissue. Furthermore, higher visceral fat content has been shown to be related to a higher incidence of vitamin D deficiency(21,22). Obesity and ethnicity are important risk factors for severe disease and are also known to modulate vitamin D levels. This may be particularly relevant in Mexico, where high rates of diabetes and obesity have been associated with an increased risk of severe COVID-19(9). Here, we evaluated the association between COVID-19 outcomes and Vitamin D levels in patients attending a COVID-19 reference center in Mexico City. We aimed to identify determinants of Vitamin D levels in COVID-19 patients and develop causal-mediation models to propose mechanisms by which Vitamin D may lead to increased COVID-19 mortality.

## **METHODS**

### *Study population*

This study included consecutive patients evaluated at the Instituto Nacional de Ciencias Médicas y Nutrición Salvador Zubirán (INCMNSZ), a COVID-19 reference center in Mexico City between 17th March and 31st May 2020 with complete vitamin D measurements at admission(10). Subjects were initially assessed at triage and required either ambulatory or in-hospital care for COVID-19 (confirmed with computerized tomography (CT) and/or via RT-qPCR test from nasopharyngeal swabs. At the time of this writing, the INCMNSZ was a reference center for COVID-19 patients, which attended primarily severe and critical cases

of COVID-19 from Mexico City. All patients had moderate to severe disease as defined by National Institute of Health criteria (*Moderate Illness*: Evidence of lower respiratory disease during clinical assessment or imaging and who have saturation of oxygen (SpO<sub>2</sub>) ≥94% on air. *Severe Illness*: SpO<sub>2</sub> <94% on air, a ratio of arterial partial pressure of oxygen to fraction of inspired oxygen (PaO<sub>2</sub>/FiO<sub>2</sub>) <300 mm Hg, respiratory frequency >30 breaths/min, or lung infiltrates >50%). Subjects underwent a chest CT, and a radiologist determined the degree of pulmonary parenchymal disease and assessed epicardial fat thickness as a proxy for visceral fat. In addition, a medical history, anthropometric measurements, and laboratory tests were obtained, including 25 hydroxy-vitamin D. The electronic files of each patient were reviewed to document the outcomes during hospitalization. All proceedings were approved by the research and ethics committee of the INCMNZ (Ref 3383) and informed consent was waived due to the nature of the study.

#### *Laboratory and clinical measurements*

Clinical variables and laboratory measures were obtained at the time of initial evaluation. Physical examination included: weight, height, body mass index (BMI, calculated as weight in kilograms divided by squared height in meters), pulse oximeter saturation (SpO<sub>2</sub>), respiratory rate (RR), temperature and arterial blood pressure (BP). Laboratory measurements included: full blood count and chemistry panel including liver function tests, C-reactive protein (CRP), fibrinogen, D-dimer, ferritin, troponin I (TPNI), erythrocyte sedimentation rate (ESR) and procalcitonin levels. The blood samples were processed in the central laboratory of the Instituto Nacional de Ciencias Médicas y Nutrición Salvador Zubirán, Vitamin D (25-hydroxivitamin D) was measured by chemiluminescence using the Abbott Architect I2000 equipment. Low levels of vitamin D were defined as <20ng/mL (<50 nmol/L) and deficient as a levels <12ng/mL (<30nmol/L) (6-9).

#### *Epicardial fat measurements*

All patients underwent unenhanced CT scans including low-dose CT and two ultra-low-dose CT protocols with commonly reported imaging features of COVID-19 pneumonia. The thoracic CT was performed using a 64-slice scanner (GE MEDICAL SYSTEMS Revolution EVO). Epicardial adipose tissue (EAT) thickness was measured at 3 points (right atrioventricular fossa, left atrioventricular fossa, and anterior interventricular fossa) in the reformatted 4-chamber view using the multiplanar reconstruction (MPR) tool on the workstation(23–26). The maximum thickness of the EAT was determined from the surface of the myocardium to the pericardium (measured perpendicular to the pericardium). The measurements were made on 2 different occasions, obtaining a total of 6 measurements; the average of them was used for all statistical analyses. Pericardial adipose tissue (PAT) was quantified with the volume measurement tool with the Carestream system of the workstation. The thickness of the thoracic subcutaneous adipose tissue (TscAT) was measured from the anterior border of the sternum to the skin, at the level of the mitral valve in the axial plane of the tomography. The 80th gender-specific percentile of EAT thickness was obtained and used as the threshold to define increased EAT thickness. In addition, chest CT findings were recorded and used to evaluate severity of COVID infection(25).

#### *COVID-19 outcomes*

Outcomes included mortality and critical disease (defined as the combination of mortality and need for mechanical ventilation /intubation). For time-to-event analyses, time from self-reported symptom onset prior to evaluation until last follow-up (censoring) or death, whichever occurred first was estimated.

#### *Statistical analyses*

Cases with low and deficient vitamin D levels were analyzed using Student's t-test or Mann-Whitney U according to the variable distribution (parametric or non-parametric) for continuous variables. The chi-squared test was applied for categorical variables.

Logarithmic, squared root and cubic root transformations were carried out to ensure variable symmetry prior to modeling. Missing data on predictors other than Vitamin D were multiply imputed using the *mice* R package under the assumption of data missing completely at random and combined using Rubin's rules. All statistical analyses were conducted using R software version 4.0.2.

#### *Predictors of vitamin D levels*

Linear regression analyses were fitted to identify predictors of log-transformed vitamin D levels in patients with COVID-19, and model selection was carried out using minimization of the Bayesian Information Criterion (BIC). Logistic regression models were also fitted using a dummy variable which defined low and deficient vitamin D to identify predictors for these categories and again model selection was conducted using BIC. Finally, model diagnostics for linear regression were conducted using residual analyses and the Hosmer-Lemeshow test for logistic regression analyses.

#### *Prediction of mortality and severe COVID-19*

Cox proportional risk regression analyses was used to investigate the association of vitamin D with mortality related to COVID-19. Univariate models and fully adjusted models were generated which included the following covariates: age, gender, BMI, C-reactive protein, D-dimer, ultrasensitive cardiac troponin, epicardial fat, T2D, CKD and oxygen saturation levels. An interaction effect was explored with BMI or BMI categories to rule out the differential impact of vitamin D adjusted for BMI. Model diagnostics were done using Schoenfeld residuals. Results are presented with Hazard Ratios (HR) and its corresponding 95% confidence intervals. Finally, the association of vitamin D with requirement for mechanical ventilation or the composite of critical COVID-19 was explored using logistic regression analyses adjusted for the covariates. Results are presented with Odds Ratios (OR) and its corresponding 95% confidence intervals.

### *Causal mediation models*

Finally, to explore whether variables which are influenced by Vitamin D levels may act as a mediator of the risk conferred by Vitamin D on COVID-19 severity, model-based causal mediation analyses were developed: D-dimer and ultrasensitive cardiac troponins were proposed as mediators of the effect of Vitamin D on COVID-19 mortality. All mediation analyses were performed using the mediation R package; to permit inference to obtain a 95% confidence interval using bias-corrected accelerated non-parametric bootstrap. To demonstrate the sequential ignorability assumption, a sensitivity analysis was run to demonstrate residual confounding by varying the correlation between the residuals of both the outcome and the moderator models. Statistical analyses were performed using R software version 4.0.3. A p value <0.05 was considered statistically significant

## **RESULTS**

### *Study population*

This study included 551 patients with confirmed COVID-19 (with compatible computerized tomography findings and/or positive RT-qPCR test from nasopharyngeal swabs) and vitamin D measurements. The mean age of participants was 51.92±13.74 years, with a male predominance (n=355, 64.4%), and a mean BMI of 30.05±5.72. Median follow-up was 15.0 days (IQR 10.0, 20.0) and 445 patients required hospitalization (81.1%). Overall, 93 patients received invasive mechanical ventilation (16.88%) and 116 in-hospital deaths (21.1%) were recorded. Type 2 diabetes (T2D) was present in 146 patients (26.9%), 219 patients had obesity (42.7%) and 217 were overweight (42.4%). Mean vitamin D levels were 21.78±9.01 and vitamin D levels below 20ng/mL were present in 251 subjects (45.6%) (**Table 1**). Extremely low vitamin D levels (≤12ng/mL) were observed in 59 patients (10.7%) (**Table 1 supplementary material**).

### *Determinants of Vitamin D levels amongst patients with COVID-19*



The pathophysiological adaptations to COVID-19 may be predictive of low vitamin D levels. To this end, determinants of low vitamin D in COVID-19 were sought in an attempt to develop a mechanistic explanatory model for this relationship. Subjects with low vitamin D levels (<20mmg/dl) were more likely to be female, have type 2 diabetes, higher HbA1c, D-dimer and ferritin levels and lower oxygen saturation, albumin and C-reactive protein. Using linear regression, a lower log-transformed vitamin D level was independently associated with female gender, higher log-transformed ultrasensitive cardiac troponin, higher log-transformed D-dimer, higher log-transformed epicardial fat area, and lower C-reactive protein levels (**Table 2**). When exploring a model to detect low vitamin D levels, there was a significantly higher odds for log-transformed D-dimer levels (OR 1.31, 95%CI 1.06, 1.63); lower odds were associated with male gender (OR 0.45, 95%CI 0.31, 0.65), higher oxygen saturation levels (OR 0.98, 95%CI 0.97, 0.99) and higher C-reactive protein values (OR 0.75, 95%CI 0.61, 0.92), adjusted for age, and log-transformed epicardial fat. There was no association between days from symptom onset and vitamin D levels at admission.

#### *Vitamin D levels and COVID-19 mortality*

Overall, vitamin D levels were significantly lower when comparing non-fatal to fatal COVID-19 cases (22.41±9.34 vs. 19.44±67.19, p<0.001). When assessing risk related to the association between mortality and vitamin D levels using Cox regression, a 1-unit increase in vitamin D levels was associated with a decreased risk of COVID-19 mortality. Interestingly, when stratifying cases according to gender, the difference in vitamin D levels between fatal and non-fatal cases was greater in women compared to men and lower in cases with obesity (**Figure 1**). When the mortality models were adjusted for age, gender, BMI, and C-reactive protein, CKD and T2D the observed association between vitamin D levels and a decrease in COVID-19 mortality persisted (**Table 3**). There was no significant interaction with BMI, (as a continuous variable or categorized) in normal weight, overweight

and obese with vitamin D levels. Using post-estimation simulation to predict risk associated with changes in vitamin D levels using the simPH R package, there was a steady decrease in risk attributable to increasing vitamin D concentrations using vitamin D <20ng/mL and  $\leq 12$ ng/mL as thresholds (**Figure 2**).

#### *Vitamin D and critical COVID-19*

When assessing the impact of vitamin D on the risk of invasive mechanical ventilation there was no significant association even after adjustment for age, gender, BMI, C-reactive protein, CKD or T2D status (OR 0.986, 95%CI 0.957, 1.015,  $p=0.366$ ). However, when assessing the composite of critical COVID-19 using logistic regression models, lower vitamin D levels were associated with critical COVID-19 (OR 0.97, 95%CI 0.94, 0.99,  $p=0.042$ , adjusting by age, gender, BMI, C-reactive protein, D-dimer, CKD, SpO<sub>2</sub> or T2D status).

#### *Causal mediation models*

Finally, model-based causal mediation models were developed to assess whether the effect of vitamin D (E) on increased mortality risk (Y) was mediated through changes in variables identified in **Table 2** (M), adjusted for age, gender, BMI and epicardial fat. The direct effect of vitamin D on increased mortality risk was significant ( $\Delta_{E \rightarrow Y}$  -0.144, 95%CI -0.069, -0.010) and the indirect effect of vitamin D, mediated by increase D-dimer levels ( $\Delta_{E \rightarrow MY}$  -0.035, 95%CI -0.164, -0.010), represented 19.3% (95%CI 9.5, 77.0%) of the overall association of vitamin D on mortality. A similar scenario was observed for cardiac troponins, whereby both the direct effect of vitamin D on mortality ( $\Delta_{E \rightarrow Y}$  -0.133, 95%CI -0.150, -0.020) and the indirect effect mediated by ultrasensitive cardiac troponins ( $\Delta_{E \rightarrow MY}$  -0.047, 95%CI -0.085, -0.020), were significant and represented 26.2% (95%CI 14.9, 73.0%) of the overall effect of vitamin D on mortality. Notably, there were no significant causal mediation models for either BMI or epicardial fat, here there was only a direct effect on mortality, independent of vitamin D levels.

## DISCUSSION

In this study, the association between vitamin D levels and severity of COVID-19 was explored in a Mexican population. Deficient levels of vitamin D (deficiency) showed a clear association with mortality, even after adjusting for confounders, including epicardial fat as a proxy of visceral fat and BMI. A vitamin D level <20ng/mL (<50nmol/L), showed a strong negative predictive value, suggesting that when levels are adequate, the probability of mortality is low. Furthermore, the increased risk of mortality from COVID-19 was partly mediated by the effect of vitamin D on markers of disease severity, such as D-dimer and ultrasensitive cardiac troponins, independent of BMI and epicardial fat (these showed effects on COVID-19 mortality independent of vitamin D levels). This suggests that vitamin D may be a marker of an impaired response to infection within the pulmonary epithelium, most notably in those with severe deficiency(27).

Several studies have explored the relationship between COVID-19 and vitamin D levels(18,20,27,28). These include those examining vitamin D levels and risk of infection and those examining an association with severity of COVID-19. Higher levels of IL-6 were observed in vitamin D deficiency suggesting a greater inflammatory response in these patients(29,30). A recent systematic review and meta-analysis reported that vitamin D deficiency was not associated with increased risk of infection, but severe cases presented with greater vitamin D deficiency compared with mild cases. Vitamin D deficiency has been associated to increased hospitalization and mortality risk from COVID-19(16,18). Physiological mechanisms by which vitamin D exerts a protective function include enhanced innate immunity including augmentation of physical barriers to infection and optimization of adaptive immunity(27). Vitamin D has also been proposed to exert a modulatory effect on the inflammatory response caused by COVID-19 by curbing adaptive immunity through inhibition of B cell proliferation, differentiation and production of antibodies and plays a role

in regulation the T cell phenotype. Thus, there is a shift in the adaptive immune response from Th1 to a more regulatory Th2 response, characterized by an increase in expression of Th2 associated cytokines. This may attenuate the quantity of pro-inflammatory cytokines that are associated with severe infection(27). In addition, vitamin D induces ACE-2 expression, and suppresses the angiotensin-renin system, thus reducing levels of proinflammatory angiotensin II. Hence, vitamin D deficiency, could potentiate the cytokine storm perpetuating a pro-inflammatory state and worsening pulmonary outcomes(28,29). Finally, thrombotic complications are common in such patients; vitamin D is also involved in the regulation of thrombotic pathways(31,32). The mechanisms through which Vitamin D may influence pro-thrombotic pathways is closely related to its anti-inflammatory properties, which reduce endothelial activation and oxidative stress(33). In our study, low vitamin D levels in COVID-19 patients were related to inflammatory, pro-thrombotic and metabolic markers of severity, confirming observations from previous studies.

Adverse COVID-19 outcomes have been linked to the ethnic origin of the population under study and its socio-economic characteristics; this has also been associated with the presence of vitamin D deficiency. Asians, African Americans, and ethnic minorities are at an increased risk of mortality from COVID-19(34). This may partly be due to a decrease in the production of vitamin D dependent on UV rays. This is related to the skin levels of melanin present in these populations and on the unequal distribution of poverty and cardiometabolic disease rates across such ethnicities and populations. This finding is relevant and may explain lower vitamin D levels and severity of COVID-19 in México in previous studies(35–37). Previous reports in similar populations, including Hispanics, have shown higher risk of severe SARS-CoV-2 infection, compared to Caucasian population(38). This could be attributable to increased cardio-metabolic comorbidities in cases from Mexico, where vitamin D deficiency is more prevalent in type 2 diabetes and obesity primarily due to increased adiposity, as supported by our results(39). The relationship between vitamin D levels and

sex may also underlie our finding of lower vitamin D levels in women, who have increased adiposity content compared to males(40). Low vitamin D levels may also occur in CKD, by reduced expression of 1-alpha hydroxylase; given a large, despite its influence on Vitamin D status, our study only included a reduced number of cases with CKD. Currently, routine vitamin D supplementation in hospitalized patients with COVID-19 is not recommended. A recent clinical trial study showed that administration of a high dose of calcifediol or 25-hydroxyvitamin D, did not reduce length of hospital stay in patients COVID-19 (20). Ideally, additional large randomized controlled trials are needed to properly assess this claim and whether vitamin D supplementation can significantly impact risk of severe COVID-19.

This study has certain strengths and limitations. It included a large sample of patients with heterogeneous risk profiles in whom a variety of disease severity parameters were measured. In addition, a series of statistical tests were carried out to ensure minimal possibility of residual confounding. Nevertheless, some limitations must be acknowledged to properly interpret this study. First, a chemiluminescence immunoassay was used to assess vitamin D levels, this may lead to inconsistent results compared to other techniques including competitive binding protein - CBP, radioimmunoassay - RIA liquid chromatography - LC, UV detection with liquid chromatography and liquid chromatography mass spectrometry LCMS or tandem mass spectrometry. Since most patients were attended in the institution for the first time for COVID-19, historic vitamin D values were not available to assess the effect of vitamin D dynamics on infection risk or outcomes. Furthermore, given the disease course of COVID-19, severity profiles are highly heterogeneous even amongst hospitalized patients, which may influence vitamin D values based on varying severity; control for this factor using propensity score matching was carried out, however, there remains a possibility for residual confounding. Finally, since this is a secondary analysis, post-hoc sample size calculation was not performed, and negative results should be interpreted with caution. Notably, these results are from a COVID-19 reference center in Mexico City, this could reduce the

representativeness of the findings primarily to severe and critical forms of COVID-19 from the central region of Mexico. Further evidence in other regions of Mexico to confirm the role of vitamin D as a marker of disease severity and mortality in Mexicans with COVID-19 is needed.

## **Conclusions**

Vitamin D levels  $\leq 12$  ng/ml (30nmol/L) are independently associated with COVID-19 mortality, even after adjusting for confounders, including measures of visceral and total body fat. No association was confirmed between vitamin D levels and the need for intubation. Vitamin D deficiency is more prevalent in women and patients with type 2 diabetes mellitus. Vitamin D supplementation may be considered in deficient patients, but evidence of benefit is required from double blind randomized controlled trials.

**CONFLICT OF INTEREST/FINANCIAL DISCLOSURE:** Nothing to disclose.

**DATA AVAILABILITY:** Data is available from the corresponding author upon reasonable request. Code for reproducibility of results available at: [https://github.com/oyaxbell/covid\\_metabolism](https://github.com/oyaxbell/covid_metabolism)

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**CONTRIBUTIONS:** research idea and study design: RM, OYBC, CAAS; data acquisition: RM, PEVC, NRP, MAJA, CIPC, BRE, JCVG, CAAS; data analysis/interpretation: OYBC, RM, CAAS, NEAV, AVV; statistical analysis: OYBC, NEAV; manuscript drafting: RM, OYBC, NEAV, AVV, CAAS; supervision or mentorship: RM, CAAS, APL, JSO. Each author contributed important intellectual content during manuscript drafting or revision and accepts accountability for the overall work by ensuring that questions pertaining to the accuracy or integrity of any portion of the work are appropriately investigated and resolved.

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## TABLES

**Table 1.** Clinical characteristics, imaging findings and severity scores in patients with COVID-19, comparing cases with and without low vitamin D levels. Values are presented as mean ( $\pm$  standard deviation) or median (inter-quartile range), where appropriate.

Parameter	Vitamin D	Vitamin D	P-value
	[>20 ng/mL] (n=300)	[ $\leq$ 20 ng/mL] (n=251)	
Age (years)	53.0 ( $\pm$ 14.92)	51.0 ( $\pm$ 12.60)	0.088
Male Sex (%)	219 (73)	136 (54.2)	<0.001
Low-Socioeconomic Status (%)	203 (67.66)	172 (68.5)	0.902
Critical outcome (%)	85 (28.3)	81 (32.3)	0.363
Intubation (%)	53 (17.6)	40 (15.9)	0.670
Mortality (%)	57 (19)	59 (23.5)	0.23
Arterial Hypertension (%)	83 (27.94)	89 (35.9)	0.058
Type 2 diabetes (%)	68 (22.9)	78 (31.6)	0.031
Time since diagnosis (years)	9.8 ( $\pm$ 7.8)	9.20 ( $\pm$ 7.5)	0.831
Obesity (%)	118 (39.9)	111 (44.9)	0.269
Smoking status (%)	15 (5.8)	12 (5.8)	0.789

CKD (%)	6 (2.0)	12 (4.9)	0.111
CVD (%)	6 (2.0)	10 (4.0)	0.258
Cirrhosis (%)	0 (0)	3 (1.21)	0.186
BMI (kg/m <sup>2</sup> )	29.83(±4.9)	30.3 (±6.6)	0.343
Respiratory Rate (rpm)	28.5 (±12.4)	28.3 (±9.11)	0.821
Heart Rate (bpm)	102.3 (±18.2)	101.9 (±18.5)	0.771
Systolic Arterial Pressure (mmHg)	120 (110-131)	123 (110-135)	0.264
Diastolic Arterial Pressure (mmHg)	76 (70-80)	74 (67-81)	0.322
Oxygen saturation (%)	82.65 (±11.4)	79.89 (±13.4)	0.010
C-reactive protein	14.9 (9.0-23.2)	13.6 (6.4-21.8)	0.052
Glucose levels (mg/dL)	149.7 (±85.7)	163.6 (±98.0)	0.081
HbA1c (%)	6.1 (5.8-7.1)	6.9 (6.0-9.6)	0.004
Triglycerides (mg/dL)	149 (114-192)	140 (110-179)	0.291
HDL-C (mg/dL)	32.7 (±15.3)	33.3 (±10.7)	0.911
LDL-C (mg/dL)	95.9 (±57.4)	75.1 (±34.7)	0.282
Total Cholesterol (mg/dL)	159.5 (±60.9)	135.7 (±44.2)	0.266

Hemoglobin (%)	15.45 (1.9)	17.4 (23.0)	0.179
Platelet Count (1,000 cells/uL)	231.0 (90.9)	236.5 (103.8)	0.509
Lymphocytes (1,000 cells/uL)	8.9 (4.4)	9.2 (4.9)	0.529
Neutrophils (cells/uL)	6435.0 (4699.1)	6336.8 (5227.2)	0.819
Serum Creatinine (mg/dL)	0.9 (0.8-1.2)	0.9 (0.7-1.2)	0.645
Ferritin (mg/dL)	656.0 (323.3- 1138.7)	553.3 (284.7-959.7)	0.062
D-Dimer (ng/mL)	629 (401-1049)	821 (454-1376)	0.001
Protrombin time (seconds)	11.4 (10.8- 12.4)	11.4 (10.6-12.5)	0.364
Fibrinogen (mg/dL)	697.0 (556.5- 854.5)	672 (482-789)	0.014
BUN (mg/dL)	18.1 (11.6)	20.7 (17.7)	0.054
AST (U/L)	42.6 (30.5- 62.5)	41.4 (30.1-64.7)	0.679
ALT (U/L)	35.9 (23.7-55- 1)	33.50 (23.8-58.2)	0.632



Albumin (mg/dL)	3.8 (3.4-4.0)	3.6 (3.3-4.0)	0.002
Lactate dehydrogenase (U/L)	361 (291-466)	374 (278.5-498.5)	0.757
Creatinine Kinase (U/L)	116 (64-236)	104.5 (55-225.3)	0.198
Procalcitonin (ng/mL)	0.3 (0.1-0.6)	0.3 (0.2-1.2)	0.299
Symptoms (number)	5 (3-5)	4 (3-5)	0.107
Comorbidities (number)	1 (0-1)	1 (0-2)	0.001
Time hospitalized (days)	6 (3-10)	6 (3-10)	0.995
CT findings			
Epicardial fat (%)	9.3 (7.3-11.7)	10 (8.2-12.2)	0.011
Pericardial fat (%)	185 (61.7)	145 (57.8)	0.407
Subthoracic fat (%)	15 (10-21)	17 (12-24)	0.010
Ground glass opacity (%)	297 (99)	248 (98)	0.710
Consolidations (%)	158 (53.6)	136 (54.2)	0.781
GGO + Consolidations (%)	158 (53.6)	136 (54.2)	0.721
Lobules affected	34 (11.3)	34 (11.3)	0.178
1 (%)	82 (32.7)	125 (41.7)	
2 (%)	132 (52.6)	140 (46.6)	
3 (%)			
Hepatic steatosis (%)	99 (33)	90 (35.9)	0.539

### Severity scores

NEWS (points)	8 (6-9)	8 (7-9)	0.733
QSOFA (points)	1 (1-1)	1 (1-1)	0.329
CURB-65 (points)	1 (0-2)	1 (0-2)	0.347

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Abbreviations: NEWS, National Early Warning Score; QSOFA, Quick Sequential Organ Failure Assessment Score; CURB-65, CURB-65 Score for Pneumonia Severity; GGO, Ground Glass Opacity; CT, Computed Tomography; CKD, Chronic Kidney Disease; CVD, Cardiovascular Disease; BUN, Blood Urea Nitrogen; BMI, Body mass index.

**Table 2.** Multiple linear regression model to identify determinants of Vitamin D levels in patients with COVID-19.

Model	Parameter	$\beta$ - coefficient	95%CI	t	P- value
Vitamin D $R^2=0.1091$	Intercept	3.515	3.177,3.853	20.426	<0.001
	Male Sex	0.168	0.097, -0.238	4.668	<0.001
	Ultrasensitive troponin	-0.033	-0.063, -0.002	-2.124	0.034
	D-dimer	-0.060	-0.100, -0.020	-2.951	0.003
	C-reactive protein	0.065	0.026, 0.103	3.265	0.001
	Epicardial fat	-0.126	-0.222, -0.031	-2.599	0.010
	Type 2 diabetes	-0.072	-0.147, 0.004	-1.871	0.062

Abbreviations: 95%CI, 95% Confidence intervals

**Table 3.** Cox proportional risk regression models to predict mortality related to COVID-19 using Vitamin D levels adjusted for covariates. Model 1: Unadjusted, Model 2: Adjusted for age, gender, body-mass index (BMI) and C-reactive protein (CRP), Model 3: Model 2 adjusted for chronic kidney disease (CKD), epicardial fat and type 2 diabetes (T2D).

Model	Parameter	$\beta$ - coefficient	HR (95%CI)	P-value
Model 1 c-statistic=0.566	Vitamin D	-0.036	0.965 (0.942, 0.988)	0.003
	Vitamin D	-0.043	0.938 (0.934, 0.983)	0.001
Model 2 c-statistic=0.694	Age	0.037	1.037 (1.022, 1.052)	<0.001
	Male gender	0.787	2.196 (1.373, 3.512)	0.001
	BMI	0.038	1.039 (1.005, 1.073)	0.024
	CRP	0.004	1.004 (1.002, 1.007)	<0.001
Model 3 c-statistic=0.702	Vitamin D	-0.039	0.962 (0.935, 0.989)	0.006
	CKD	0.301	0.749 (0.276, 2.030)	0.570
	T2D	0.325	1.384 (0.882, 2.170)	0.157
	Ultrasensitive cardiac troponin	0.170	1.185 (1.002, 1.403)	0.048
	D-dimer	0.003	1.003 (0.804, 1.252)	0.980

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Oxygen saturation	-0.026	0.975 (0.960, 0.990)	0.001
Epicardial fat thickness	0.669	1.952 (0.501, 7.607)	0.335

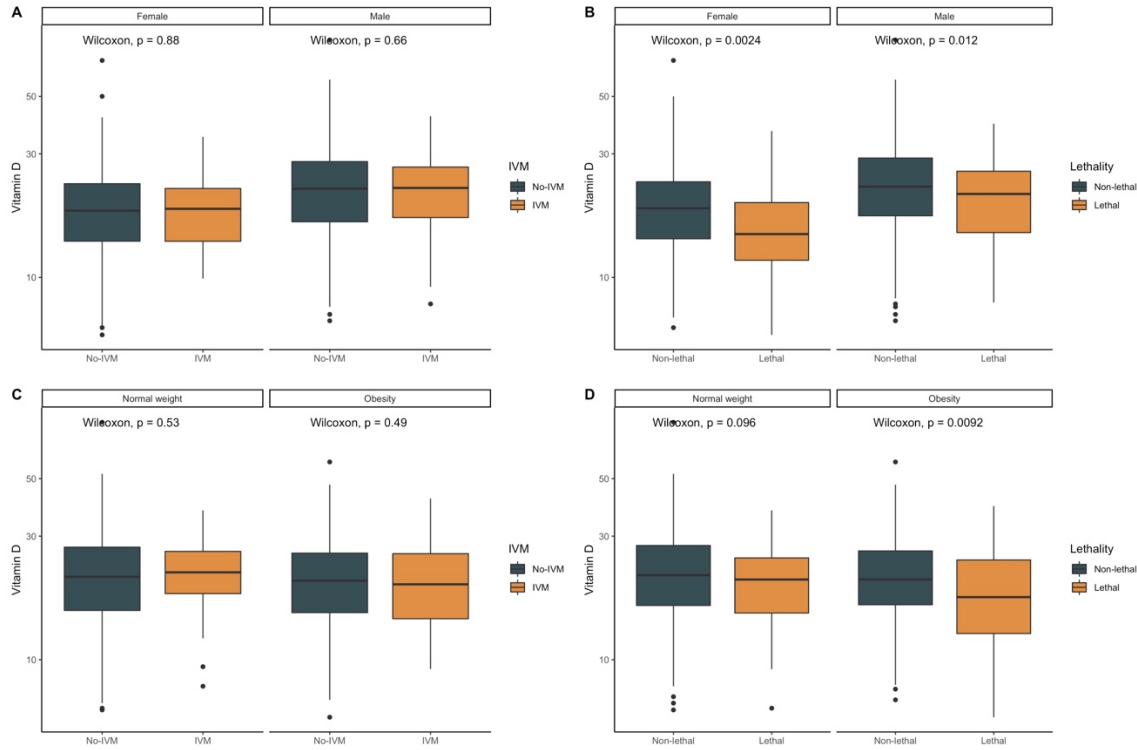
Abbreviations: CKD, Chronic Kidney Disease; BMI, Body mass index; CRP, C-reactive protein; T2D, Type 2 diabetes mellitus; HR, Hazard Ratio; 95%CI, 95% Confidence Interval

**Table 4:** Causal mediation analyses predicting the effect of Vitamin D levels (E) mediated by elevated D-dimer, ultrasensitive cardiac troponins or low SpO2 (M) on severe COVID-19 and mortality (Y), adjusted by gender, age, BMI and epicardial fat.

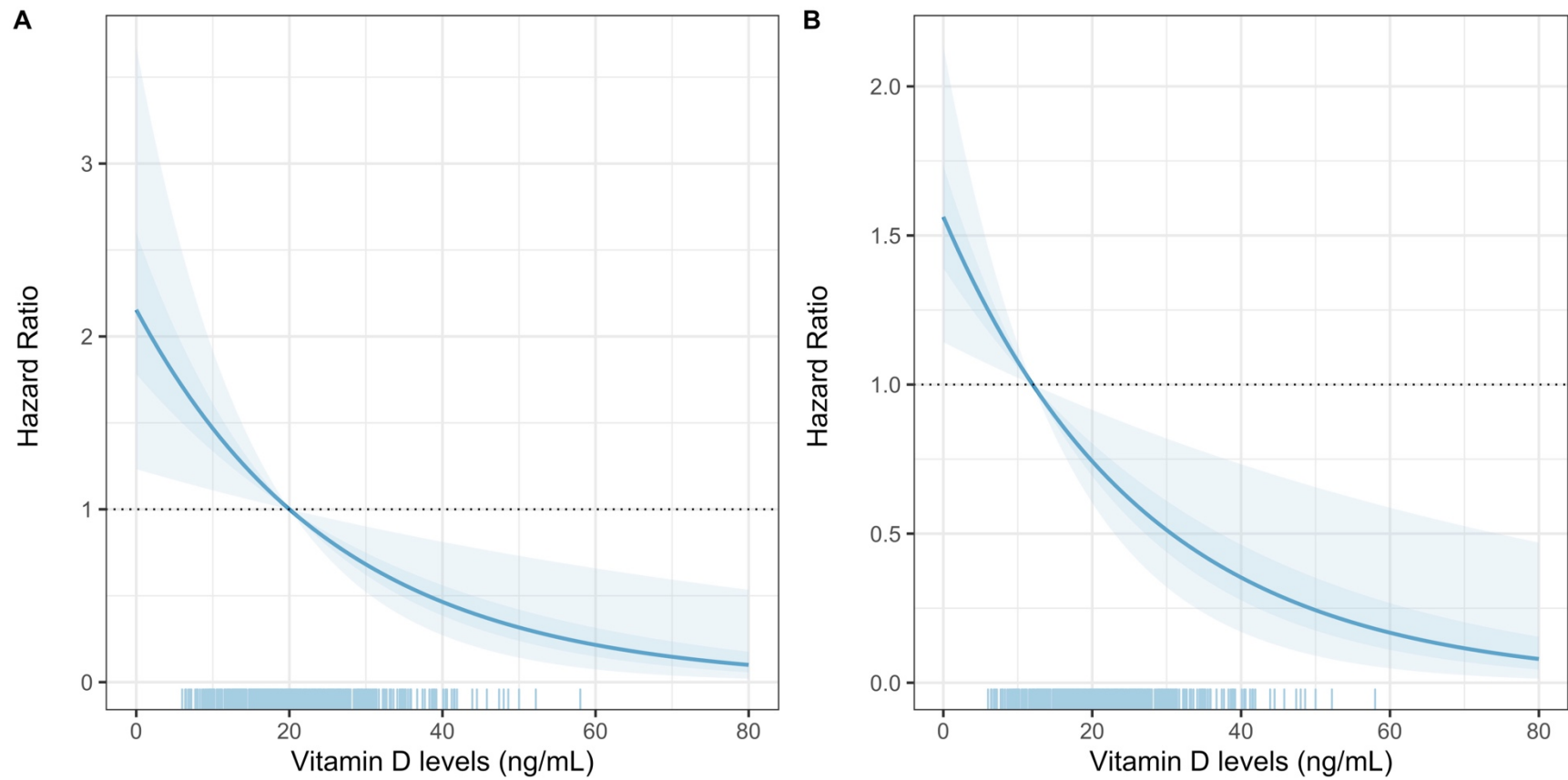
**Abbreviations:** ACME: average causal mediation effects; ADE: average direct effects; SpO2: Oxygen saturation levels.

Outcome (Y)	Efector (E)	Mediator (M)	ACME (95%CI)	ADE (95%CI)	Total Effect (95%CI)	Proportion Mediated (95%CI)
COVID-19 Mortality	Vitamin D	D-dimer	-0.035 (-0.069,-0.010)	-0.144 (-0.164, -0.10)	-0.179 (-0.188,-0.050)	19.3% (9.5-77.0%)
		Ultrasentivie cardiac troponins	-0.047 (-0.085, -0.020)	-0.133 (-0.150, -0.020)	-0.181 (-0.183, -0.060)	26.2% (15.0-73.0%)
		SpO2	-0.037 (-0.066, -0.010)	-0.144 (-0.159, -0.030)	-0.181 (-0.186,-0.050)	20.3% (9.7-64.0%)

## FIGURE LEGENDS

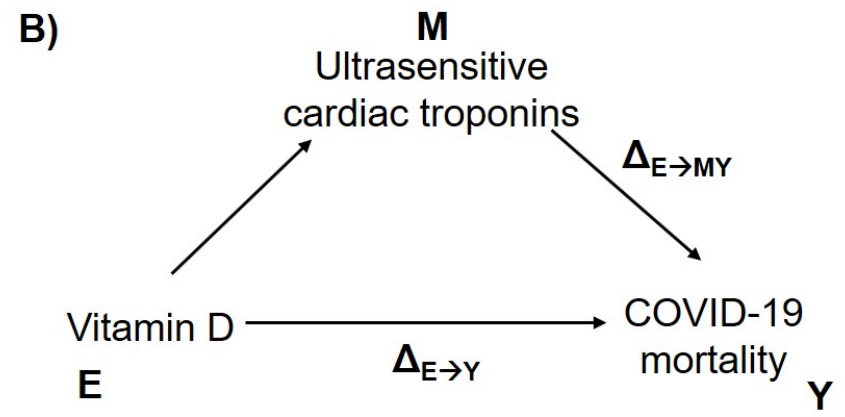
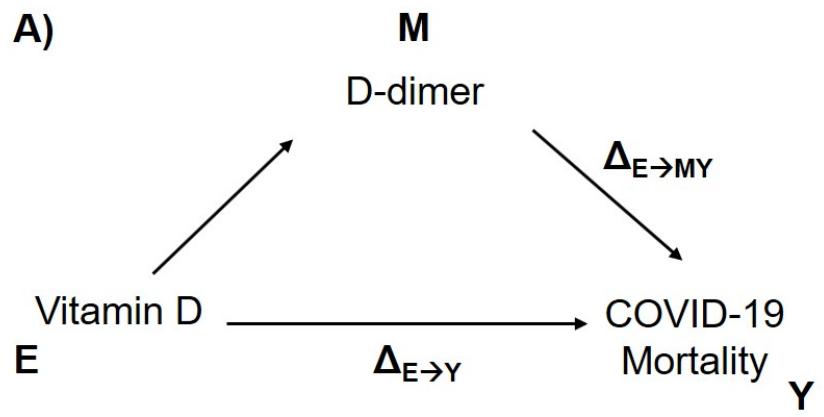


**Figure 1.** Boxplots comparing Vitamin D levels according to the need for invasive mechanical ventilation (IVM) or lethal COVID-19 stratified by gender (A-B) and by body-mass index categories (C-D).



**Figure 2.** Post-estimation simulation of Vitamin D levels to predict COVID-19 lethality, adjusted for age, sex, BMI, C-reactive protein, epicardial fat, D-dimer, oxygen saturation, T2D, and CKD using Vitamin D cut-offs of  $<20\text{ng/dL}$  (A) and  $\leq 12\text{ng/mL}$





**Figure 3.** Model-based causal mediation analyses to investigate the role of Vitamin D on COVID-19 mortality mediated by D-dimer (A), ultrasensitive cardiac troponins (B)