

SARS-CoV-2 Viremia is Associated with COVID-19 Severity and Predicts Clinical Outcomes

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Summary: Plasma SARS-CoV-2 RNA was detected in most hospitalized COVID-19 patients including all critically-ill patients, and the levels of RNA are strongly associated with disease outcome. SARS-CoV-2 virions were identified in plasma using multiple complementary approaches.

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Abstract

Background: SARS-CoV-2 viral RNA (vRNA) is detected in the bloodstream of some patients with COVID-19 (“RNAemia”) but it is not clear whether this RNAemia reflects viremia (i.e., virus particles) and how RNAemia/viremia is related to host immune responses and outcomes.

Methods: SARS-CoV-2 vRNA was quantified by ultra-sensitive RT-PCR in plasma samples (0.5-1.0 ml) from observational cohorts of 51 COVID-19 patients including 9 outpatients, 19 hospitalized (non-ICU), and 23 ICU patients, and vRNA levels compared with cross-sectional indices of COVID-19 severity and prospective clinical outcomes. We used multiple imaging methods to visualize virions in pelleted plasma.

Results: SARS-CoV-2 vRNA was detected in plasma of 100%, 52.6% and 11.1% of ICU, non-ICU, and outpatients respectively. Virions were detected in plasma pellets by electron tomography and immunostaining. Plasma vRNA levels were significantly higher in ICU > non-ICU > outpatients ($p < 0.0001$); and for inpatient, plasma vRNA levels were strongly associated with higher WHO score at admission ($p = 0.01$), maximum WHO score ($p = 0.002$) and discharge disposition ($p = 0.004$). A plasma vRNA level $> 6,000$ copies/ml was strongly associated with mortality (HR: 10.7). Levels of vRNA were significantly associated with several inflammatory biomarkers ($p < 0.01$) but not with plasma neutralizing antibody titers ($p = 0.8$).

Conclusions: Visualization of virus particles in plasma indicates that SARS-CoV-2 RNAemia is due, at least in part, to viremia. The levels of SARS-CoV-2 RNAemia quantified by ultrasensitive RT-PCR correlate strongly with disease severity, patient outcome and specific inflammatory biomarkers but not neutralizing antibody titers.

Keywords: SARS-CoV-2 viremia, SARS-CoV-2 RNAemia, COVID-19 outcome

Introduction

The COVID-19 pandemic is the largest public health emergency in modern history, resulting from global spread of the newly-emerged coronavirus SARS-CoV-2, a ~30kb single-stranded positive-sense RNA virus [1, 2]. The respiratory tract epithelial cells are the primary target of SARS-CoV-2, and the primary clinical syndrome of COVID-19 is one of upper and lower respiratory tract infection. The broad expression of the SARS-CoV-2 receptor ACE2 in extrapulmonary tissues could expand viral tropism. Indeed, a wide range of extrapulmonary symptoms including loss of smell and taste, vomiting and diarrhea, and neurologic impairment have been reported [3]. Detection of SARS-CoV-2 RNA in the gastrointestinal tract, endothelium and central nervous system implicates extrapulmonary dissemination as an important contributor to disease manifestations severity [4-12]. Current data do not suggest that SARS-CoV-2 replicates in peripheral blood cells; however, systemic dissemination of virus through the bloodstream to extrapulmonary sites is possible. Aside from a central role in disease pathogenesis, viral RNA (vRNA) in blood could represent an important indicator of lung barrier breakdown, leading to release of intact virions, virion components (proteins and nucleic acids), or infected cell fragments into the bloodstream. Although some groups have found that the detection of SARS-CoV-2 RNA in plasma (SARS-CoV-2 RNAemia) is associated with severe disease, [13-24] it is unclear whether vRNA detected by RT-PCR is in virions and thus reflects viremia.

Higher levels of serum antibodies to SARS-CoV-2 proteins have been reported in patients with more severe disease and who are immunocompetent [25, 26], suggesting that antibodies may not protect against severe disease, and thus raises questions about the potential benefit of antibody-based therapies in severely ill people. Studies of monoclonal antibodies and convalescent plasma therapy have not shown clinical benefit in late stages of disease, which provides further evidence that antibodies may fail to clear infection in severely ill people [27-32]. Recently, however, combination monoclonal antibody therapy

(casivirimab + indevimab) was shown to modestly improve outcome in hospitalized patients who have not generated antibodies to SARS-CoV-2-[33]. In the absence of antibody therapy, inconsistent associations between SARS-CoV-2 specific neutralizing antibodies and SARS-CoV-2 RNAemia have been reported [16, 21, 22, 25, 34], suggesting that neutralizing antibody level and function vary between patients and may not prevent viral dissemination in some.

In the current study, we investigated 1) whether RNAemia is an indicator of SARS-CoV-2 viremia (i.e., virus particles in blood); 2) how often RNAemia can be detected among outpatients and hospitalized patients, 3) whether the level of RNAemia is associated with clinical outcome including mortality, and 4) the relationship between RNAemia and host immune responses including neutralizing antibody and markers of inflammation.

Results

Cohort characteristics:

We enrolled 51 patients with COVID-19, stratified by location of the clinical encounter in three groups: i) critically ill patients in the Intensive Care Unit (ICU, n=23), ii) moderately ill inpatients hospitalized in dedicated wards for COVID-19 (non-ICU inpatients, n=19), and iii) outpatients with mild illness (n=9) [35, 36]. Comparisons of baseline characteristics, therapies and outcomes are shown in Table 1. ICU patients had significantly higher 60-day mortality than non-ICU inpatients (n=7, 30.4% vs. 0%, p=0.01). ICU patients had higher levels of interleukins 6, 8 and 10 (IL-6, IL-8, IL-10), procalcitonin, suppression of tumorigenicity (ST)-2 and pentraxin-3 compared to non-ICU inpatients (all p =<0.01, Table S1). There was no significant difference in neutralizing antibody titer by plaque reduction assay between ICU and non-ICU inpatients (Table 1; p = 0.22). At the time of study there were no SARS-CoV-2 variants of concern identified at the enrolled patient locations.

Baseline plasma levels of SARS-CoV-2 RNA and patient outcomes:

Plasma SARS-CoV-2 RNA was detectable at baseline in all 23 ICU patients, but only 10 of 19 (52.6%) non-ICU inpatients and in one (11.1%) outpatient ($p < 0.0001$). ICU patients had $>3,000$ -fold higher median number of vRNA copies/ml (3,349 [interquartile range-IQR: 756-8,408]) compared to non-ICU inpatients (median 1 [1-72] copies/ml, $p < 0.0001$, Table 1 and Figure 1A). There was only a moderate, borderline significant association between plasma vRNA copies and Ct values from RT-PCR performed on 20 paired nasal swab specimens ($p = 0.052$, Figure S2A). We detected a weak non-significant inverse correlation between absolute lymphocyte count and plasma vRNA copies ($r = -0.3$, $p = 0.06$, Table S2), but not with other available clinical laboratory parameters (Table S2). The small overall sample size may have limited the detection of significant correlations.

Higher plasma vRNA levels at hospital or ICU admission were significantly associated with higher baseline severity of illness (as quantified by a World Health Organization [WHO] ordinal scale of ≥ 6) compared with patients having baseline WHO scale < 6 (i.e., mild hypoxemia not requiring high flow oxygen or mechanical ventilation) (Figure 1B). Viral RNA levels at baseline were also significantly associated with the worst severity of illness (peak WHO score) during hospitalization (Figure 1C; $p = 0.002$) as well as hospitalization outcome (death vs. discharge to inpatient facility or home care, Figure 1D; $p = 0.037$).

We performed a receiver operating characteristic (ROC) curve analysis to define an optimal cut-off for vRNA levels as a predictor of mortality (Figure S1). A cut-off of $>6,000$ copies/ml among all inpatients (ICU and non-ICU) was significantly associated with greater 60-day mortality (log-rank $p = 0.002$) and longer hospital stay (log-rank $p = 0.005$) in unadjusted Kaplan-Meier curve analyses (Figure 1E and F). The sensitivity and specificity of the cut-off for mortality were 67% and 86%, respectively (Figure S1). Similarly, analysis of the receiver operator characteristic (ROC) curve with an optimal Youden index (0.56) indicated a threshold of 6,352 copies/ml that offered 67% sensitivity and 89% specificity. In Cox

proportional hazards models adjusting for the confounding effects of age, sex and treatment with corticosteroids, high vRNA levels were associated with higher hazard ratio for death (adjusted HR=10.7, 95% confidence interval=1.49-76.9) and longer time to hospital discharge among survivors (adjusted HR=5.12, 95% confidence interval=1.65-15.88). We did not find a significant difference in plasma viremia in patients treated 2-3 days before sampling with remdesivir or glucocorticoids compared with patients with no treatment. Larger studies of the effects of remdesivir, glucocorticoids and other COVID-19 therapies on viremia are needed to draw conclusions.

Plasma contains SARS-CoV-2 virions

We next sought to characterize the vRNA present in plasma to determine whether it includes intact viral particles. After high speed centrifugation of a subset of plasma samples chosen to reflect a wide range of vRNA levels (6,720 – 304,333 copies/ml) with sufficient available sample volume, a median of 76% (56%-80%) of total recovered vRNA was detected in the pellet fraction (Figure 2A) indicating the vRNA detected is contained within or associated with a pelletable structure. Notably, SARS-CoV-2 RNA from positive controls (SARS-CoV-2 virions spiked into healthy human donor plasma) was found almost exclusively in the pellet fraction (99%) confirming that cell-free SARS-CoV-2 virions are pelletable using the same centrifugation conditions. In addition, when free SARS-CoV-2 RNA was added to SARS-CoV-2-negative plasma prior to centrifugation, vRNA was not recovered in either fraction, indicating that free vRNA is not stable in plasma and likely does not account for the vRNA detected in the supernatant fraction. When a subset of plasma samples was prepared for cyto-spin analysis, immunofluorescence of cyto-spin slides stained with two independent SARS-CoV-2-specific antibodies (anti-Nucleocapsid and anti-Spike) and a platelet marker (anti-CD41) revealed punctate double-positive structures that were absent in negative controls prepared from SARS-CoV-2-negative plasma (Figure 2B). A mean of 41.5% of double-positive structures co-localized with CD41 (Figure 2B). Presumptive SARS-CoV-2 virions were identified in the pellet fraction of a subset of high-

speed centrifuged plasma samples by electron microscopy and tomographic reconstruction (Figure 3A-F). Virions observed ranged from 1-4 per field of view, and presumptive virions were found within or in close proximity to presumptive platelets as well as in regions distant from identifiable cell fragments (3A-F and Supplemental movies 1-3). Presumptive SARS-CoV-2 virions were confirmed by immuno-EM using two independent antibodies (Figure 3G).

Baseline plasma levels of SARS-CoV-2 RNA and host responses:

Viral RNA levels at baseline were not significantly associated ($p=0.8$) with neutralizing antibody titers by plaque reduction neutralization test (PRNT, Figure 4A). By contrast, vRNA levels were significantly correlated with some plasma biomarkers of innate immunity (IL-6 ($p=0.006$), IL-8 ($p=0.000096$), IL-10 ($p=0.0097$), ST-2 ($p=0.00028$)) and inflammation (procalcitonin ($p=0.0074$) and pentraxin-3 ($p=.000023$)) (Figure 4B and S2B). Notably, these biomarkers were significantly different in ICU patients compared to non-ICU inpatients ($p\leq 0.1$ for all), mirroring the corresponding differences in vRNA levels (Table S1). These findings suggest that dissemination of viral infection is associated with a systemic inflammatory host response.

Longitudinal evolution of plasma levels of SARS-CoV-2 RNA:

We examined longitudinal changes of vRNA levels among inpatients with detectable plasma RNA at baseline (day 1, $n=19$) and available follow-up samples (post-enrollment day 5, $n=19$ and/or day 10, $n=13$, Figure S3). Overall, we found a significant decrease in vRNA levels between day 1 and day 5 ($p=0.041$, Wilcoxon test with Benjamini-Hochberg post hoc adjustment), between day 5 and day 10 ($p=0.041$) and between day 1 and day 10 ($p=0.001$). We further stratified the changes in vRNA according to 30-day mortality. Among survivors ($n=13$ available samples for day 1, $n=13$ for day 5 and $n=8$ for day 10), we found a significant decrease in vRNA levels between day 1 and day 10 ($p=0.018$). In non-survivors ($n=6$ on day 1, $n=5$ for day 5 and $n=5$ for day 10) we did not detect significant change between any timepoint (day 1 vs 5, $p=0.49$; day 1 vs 10, $p=0.11$; day 5 vs 10, $p=0.12$).

Although the analyses are limited by small sample size, results indicate a modest decrease in vRNA over 10 days in COVID-19 survivors, and no measurable decline in non-survivors. Although these data suggest a trend, larger studies are needed to draw conclusions.

Additionally, viremia provided further prognostic information beyond established clinical risk stratification tools (Coronavirus Clinical Characterization Consortium [4C] scores that utilize baseline variables for predicting mortality and inpatient deterioration) [37]. In a bivariate regression model predicting the worst WHO ordinal scale as a surrogate of inpatient deterioration, both viremia ($p = 0.002$) and 4C deterioration scores ($p = 0.007$) were significant predictors. In a bivariate Cox proportional hazard model for 60-day survival, viremia was a significant predictor ($p = 0.032$) but not the 4C mortality score ($p = 0.14$).

DISCUSSION

Here we show that SARS-CoV-2 RNA is detected in a substantial fraction of hospitalized patients, including 100% of patients in the ICU, and that the levels of SARS-CoV-2 RNA associate with maximal in-hospital disease severity and 60-day mortality, independent of established clinical risk stratification tools. We have also visualized SARS-CoV-2 virions in centrifuged plasma pellets using complementary imaging-based approaches. In agreement with other recent studies [21, 23], SARS-CoV-2 RNA in plasma associates with some established markers of innate immunity and inflammation commonly elevated in patients with acute respiratory distress syndrome (IL-6, IL-8, IL-10, procalcitonin and pentraxin-3) but not with SARS-CoV-2-specific neutralizing antibody measured by plaque reduction assay. Overall, these findings provide new insights into the pathogenesis and outcome of COVID-19. The strengths of our study include strong evidence that RNAemia is associated with viral particles in plasma (i.e., plasma viremia), and absolute quantitation of vRNA using a SARS-CoV-2 RNA standard rather than estimation of viral levels by Ct value or DNA standards.

Although many studies have shown that the detection of SARS-CoV-2 RNA in plasma (SARS-CoV-2 RNAemia) is associated with severe disease and/or unfavorable outcome [13-24], our study adds unique measures of disease severity to extend these earlier findings, such as associations with maximal inpatient WHO disease severity score, discharge location (LTAC, SNF or home) and mortality, as well as additional prognostic discrimination beyond established, multi-variable clinical predictors of disease severity (14C). In addition, there has been inconsistency in the reported proportion of different patient groups with detectable plasma vRNA as well as the levels of plasma vRNA. Specifically, SARS-CoV-2 RNA has been detected in plasma from 35% of patients hospitalized with COVID-19 [13] to 88% of critically ill patients [17], with clear trends in each study toward severe disease in those with RNAemia. This variability may result from differences in sample types tested (plasma or serum) or the type (digital droplet vs. qPCR) and sensitivity of the RT-PCR methods used. Here we report detection of vRNA in 79% of all hospitalized patients, and in 100% of critically ill patients (hospitalized, ICU) and 52.6% of moderately ill patients (hospitalized, non-ICU). The higher proportion of patients with detectable vRNA in the current study is likely due to the ultrasensitive method used that was based on a qRT-PCR assay of plasma HIV-1 RNA that has a 95% limit of detection of 1 copy/ml [38]. Our finding that some viral particles associate with platelets suggests that testing of plasma samples retaining platelets may be a better sample type than sera for assessing SARS-CoV-2 presence in blood because of the removal of platelets from serum with clot formation. Despite the small sample size of our cohort, we observed survivors of COVID-19 had statistically significant decreases in plasma vRNA in longitudinal samples, whereas those who succumbed did not have significant decreases, although the preliminary nature of this finding requires confirmation in additional studies. Similarly, the lack of an observed effect of therapeutic interventions such as remdesivir on plasma vRNA in the current should be confirmed in larger ones. More extensive longitudinal sampling from patients across the spectrum of disease severity, including those with progressive disease during the observation period, as well as varying

interventions, will provide additional insight into the usefulness of SARS-CoV-2 plasma RNA as a prognostic marker and a means to guide antiviral therapy.

This report is the first to show that SARS-CoV-2 vRNA in plasma is associated, at least in part, with intact SARS-CoV-2 virions in plasma. We found that vRNA is more abundant in the pelleted fraction of plasma compared to supernatant after high-speed centrifugation. While most vRNA was detected in the pellet fraction and therefore is likely associated with pelletable structures (e.g., a virus particle or an infected cell), a fraction was contained in the supernatant. Our experimental results suggest that this non-pelletable RNA is unlikely to be free vRNA because free RNA was quickly degraded after spiking into plasma. It could represent free vRNA protected by RNA-binding proteins or viral or cellular fragments, or virus particles associated with lipids or lipid-rich structures that alter its density; and, its composition may be heterogenous across individuals. Complementary methods including immunofluorescence, electron tomography, and immuno-EM confirmed the presence of SARS-CoV-2 virions in plasma from the subset of patient samples analyzed. Importantly, we were unable to determine if the SARS-CoV-2 virions were infectious because of limited sample availability. A recent study was unable to culture SARS-CoV-2 from vRNA-positive sera in Vero E6 cells [20] although optimal methods for culturing SARS-CoV-2 from blood have not been defined. To illustrate this point, we show that some SARS-CoV-2 virions associate with platelets in blood, thus it is possible that sensitivity of virus culture could be improved by using platelet-rich plasma. Future studies should optimize virus culture methods from blood and address whether virions in blood are infectious, and whether infected cells (if present) in blood are producing infectious virus. It is likely that if SARS-CoV-2 virions in the blood are infectious they lead to dissemination of infection to multiple organs [4-12, 39]. Whether SARS-CoV-2 directly infects endothelial cells remains controversial [40] and thus the mechanisms by which SARS-CoV-2 gains access to the bloodstream and infects extrapulmonary organs are unknown.

Neutralizing antibodies counter viral infections by preventing attachment and entry into cells. Clearance of infection that has disseminated to the blood in severely ill people would therefore depend, at least partially, on neutralizing antibodies to prevent seeding of extrapulmonary organs. Our study is in agreement with others that neutralizing antibody titer does not correlate with vRNA levels in blood [16, 21], suggesting that most viremic patients have already mounted a neutralizing antibody response, which underscores concern about the value of antibody-based therapies in severely ill patients. This is still an unsettled question warranting further investigation because a few studies have found an association between RNAemia and neutralizing antibody response [22]. A failure of antibody to control viremia may be attributable to sub-optimal antibody potency, specificity or function in severely ill patients [41, 42]. We did identify a small group of patients with detectable viremia and lower neutralizing antibody titers (< 100). It is possible that this patient subgroup could benefit from antibody-based therapies. Indeed, recently reported results from the RECOVERY trial report a moderate improvement in outcome from treatment with monoclonal antibodies (casivirimab + indevimab) in patients who do not have endogenously produced antibodies to SARS-CoV-2 in blood [33]. Re-analysis of existing datasets from clinical trials following quantification of viremia and pre-treatment levels of endogenous neutralizing antibodies may help identify patient subgroups with favorable responses to antibody therapy.

In summary, our findings suggest that SARS-CoV-2 viremia is a strong and independent marker of COVID-19 disease severity and outcome. Future investigation should focus on whether therapies that prevent or reduce viremia improve clinical outcomes. Clinical studies with viremia-targeted outcomes may accelerate development of effective therapies for COVID-19, similar to what occurred with antiviral therapy of other viral infections including hepatitis B [43], hepatitis C [44] and HIV-1 [45].

METHODS

Study Cohorts:

Inpatient. From April 4, 2020 through September 4, 2020, we prospectively enrolled hospitalized patients with COVID-19 from three hospitals (UPMC Presbyterian, UPMC Shadyside and UPMC East) in an observational cohort study (protocols STUDY19050099 and STUDY20040036). We included patients aged 18-90 years old, who were diagnosed with SARS-CoV-2 infection by a positive nasopharyngeal swab quantitative polymerase chain reaction (qPCR) test, and had acute illness consistent with COVID-19 as the main reason for hospitalization. Patients were hospitalized either in an intensive care unit (ICU) or in a dedicated hospital ward (non-ICU setting) for COVID-19.

Outpatient. Beginning March 11, 2020, participants ages 2 and older with confirmed or suspected SARS-CoV-2 infection were identified by provider-referral or self-referral in the outpatient clinic or community setting, and enrolled into the Molecular and Epidemiological Study of Suspected Infection (MESSI, Pro00100241), as described previously [46]. The objective of the MESSI observational study is to enroll subjects with suspected SARS-CoV-2 infection, and to collect clinical and symptom information and bank biological samples for research use. All outpatient subjects included in this study remained in outpatient or at home setting throughout the course of COVID-19 illness. SARS-CoV-2 virus testing was performed by quantitative RT-PCR from nasopharyngeal swabs. COVID-19-positive subjects included in these analyses demonstrated SARS-CoV-2 qPCR-positive result during acute infection.

IRB Approvals. All research protocols were approved by the relevant institutional IRBs, and were performed in accordance with the Declaration of Helsinki. Written informed consent was obtained from all research participants or their legally authorized representatives (LAR).

Clinical Data Extraction and Definitions:

We classified patients based on the location of delivery of care at the time of patient enrollment and biospecimen acquisition into an ICU group (i.e., critically-ill patients requiring mechanical ventilation or high levels of oxygenation support), a non-ICU group (moderately-ill inpatients) and an outpatient group of mildly symptomatic subjects. For ICU patients, we considered the date of ICU admission the baseline timepoint, whereas for non-ICU patients the date of hospital admission was considered baseline. We recorded baseline demographics, COVID-19 severity by the WHO 10-point ordinal scale (baseline and peak during hospitalization), administered COVID-19-targeted therapies, duration of mechanical ventilation for intubated patients, length of hospital stay and final outcome of hospitalization (death vs. discharge to home care or inpatient facility). When available, we also recorded the cycle threshold (Ct) value of the nasopharyngeal swab qPCR that was used to establish the clinical diagnosis of COVID-19 as a surrogate of viral load in the respiratory tract. We utilized baseline clinical and laboratory variables for estimation of the 4C scores for risks of mortality and inpatient deterioration. Clinical laboratory parameters of interest (white blood cell count, absolute lymphocyte count, platelets, D-dimer, ferritin and lactate dehydrogenase), were provided when available as part of standard clinical care. We obtained laboratory values from the electronic medical record when corresponding clinical blood draws had occurred on the same date of research sample acquisition. When clinical laboratory parameters were not available on that same date we utilized available clinical laboratory results for up to two days before or after the same date of research sample acquisition.

Experimental analyses:

Please see detailed experimental analyses in supplemental methods.

NOTES

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Table 1: Descriptive characteristics of outpatients and inpatients with COVID19, stratified by moderately-ill (hospitalized, non-ICU) vs. critically-ill (ICU). Non-parametric test comparisons were performed with Wilcoxon and Fisher's exact test for continuous and categorical variables, respectively.

	Outpatient	Inpatient, non-ICU	Inpatient, ICU	p-value*
N	9	19	23	
Demographics				
Age (median [IQR])	35.0 [26.9, 52.4]	60.0 [52.0, 66.0]	65.0 [57.5, 75.5]	0.11
Males, n (%)	2 (22.2)	9 (47.4)	16 (69.6)	0.21
Caucasian race, n (%)	4 (44.4)	15 (78.9)	12 (52.2)	0.11
BMI (median [IQR])		31.1 [29.0, 36.6]	33.8 [27.0, 39.4]	0.52
Diabetes, n (%)		4 (21.1)	7 (31.8)	0.50
COPD, n (%)		2 (10.5)	6 (26.1)	0.26
Immunosuppressed host, n (%)		2 (10.5)	4 (17.4)	0.67
Resident of nursing facility, n (%)	0 (0)	1 (5.3)	4 (17.4)	0.36
Detectable plasma SARS-CoV-2 RNA, n (%)	1 (11)	10 (53)	23 (100)	
SARS-COV-2 RNA copies (median [Range])	1 [<1, 5]	1 [<1, 918]	3349 [32, 225,320]	<0.0001
PRNT titer (median [IQR])		647.7 [23.4, 2407.5]	2487.0 [287.8, 3695.8]	0.22
COVID19 Treatments				
Remdesivir, n (%)	0 (0)	8 (42.1)	15 (65.2)	0.21

Convalescent plasma, n (%)	0 (0)	2 (10.5)	10 (43.5)	0.04
Glucocorticoids, n (%)	0 (0)	10 (52.6)	15 (65.2)	0.33
Illness Severity and Outcome				
Baseline WHO scale (median [IQR])		5.0 [4.0-5.0]	7.0 [6.0-8.0]	<0.001
Worst WHO scale during hospitalization (median [IQR])		5.0 [5.0-5.0]	9.0 [6.5-10.0]	<0.001
60-day Mortality, n (%)	0 (0)	0 (0)	7 (30.4)	0.01

FIGURE LEGENDS

Figure 1: SARS-CoV-2 RNA levels in plasma are associated with disease severity and outcome. Plasma SARS-CoV-2 RNA levels (copies/ml) by location of clinical care at baseline (A), severity of illness by WHO ordinal scale at baseline (B), and worst WHO scale during hospitalization (C) for outpatient (n=9), inpatient non-ICU (n=19) and inpatient ICU (n=24). Kaplan-Meier curves for time to discharge from hospital admission (D) and 60-day survival (E) for inpatients (both ICU and non-ICU) stratified by high (>6,000 copies/ml) vs. low (\leq 6,000 copies/ml) initial viral RNA level. Plasma SARS-CoV-2 RNA levels (copies/ml) by outcome of hospitalization among inpatients (F). Patients with undetected SARS-CoV-2 RNA in plasma are represented by open circles and graphed as one half the LLOD.

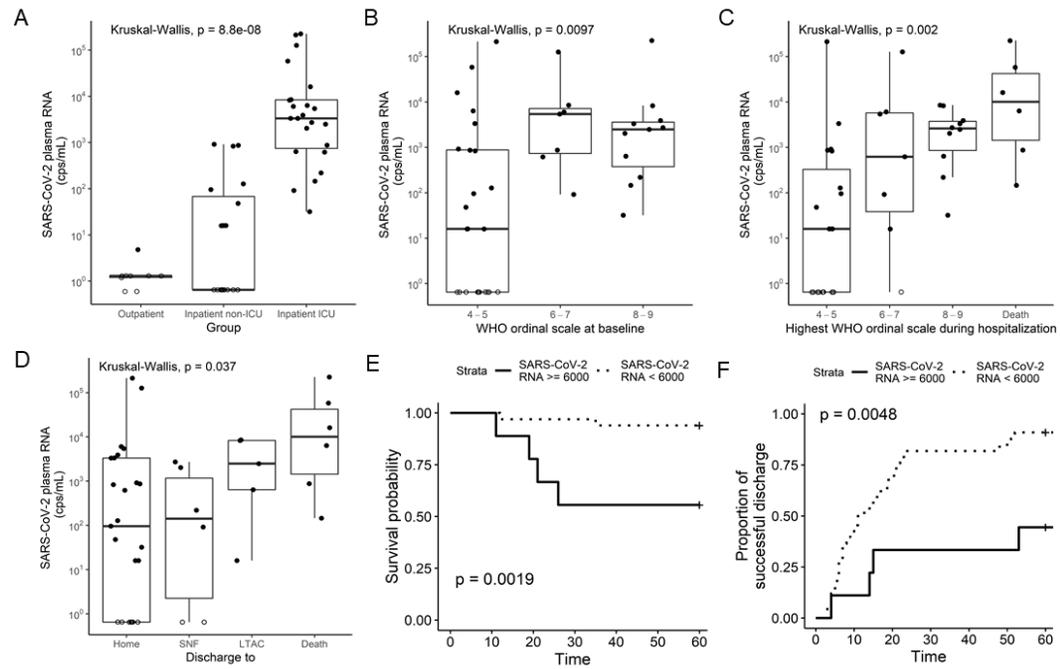
Figure 2: SARS-CoV-2 RNA in plasma includes a pelletable fraction containing virus particles. Percent of total recovered SARS-CoV-2 RNA detected in the pellet or supernatant fractions of spiked-in control SARS-CoV-2 virus or plasma from 3 inpatients with COVID-19 centrifuged at 21,000 x g for 2 hours (A). Immunofluorescence of cytopsin slides prepared from plasma of COVID-19 inpatients PID3 (upper) and PID2 (lower) including the platelet marker CD41 (upper, white; lower, blue), and SARS-CoV-2 S and N proteins (upper, red and green or yellow for colocalization; lower, white) (B).

Figure 3. SARS-CoV-2 RNA in plasma includes a pelletable fraction containing SARS-CoV-2 virus particles. Electron micrographs of pelleted fraction of plasma from two independent COVID-19 inpatients, PID2 (A, B and G) and PID1 (C-F). Montaged overview of a field of platelets surrounded by amorphous plasma material and large clusters of fibrils, possibly collagen (A and B). Tomographic reconstruction of the region indicated by the square in upper left, showing a single presumptive SARS-CoV-2 virion within a membrane-bound compartment of a platelet (B). Tomogram detail of the virion with notable core puncta, clearly delineated

membrane bilayer and distinct surface spikes (B, red dots). 2D overview image of three platelets (C). High-magnification tomographic slice of a presumptive SARS-CoV-2 virion within an enclosed compartment of a platelet (D). Tomogram detail of a group of vesicles. Two spherical structures conform to presumptive SARS-CoV-2 virions (E, red arrowheads). Tomogram of a second platelet within the field, similarly surrounded by small vesicles (F). Tomogram detail of the area indicated by the rectangle in F, showing 3 presumptive virions adjacent to the platelet (F, inset). Presumptive virions were identified as described (Methods) and by comparisons with analogous EM of SARS-CoV-2–infected cultured cells. Immuno-EM image from pelleted fraction of plasma of PID2; presumptive SARS-CoV-2 virion labeled with anti-N (large 15 nm) gold particle and anti-S (smaller 10 nm) gold particles (G).

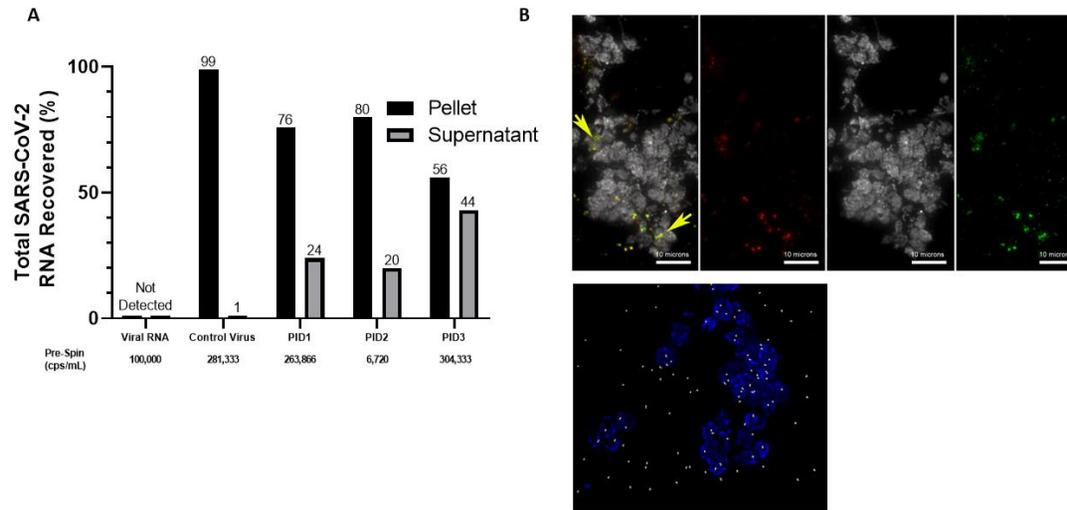
Figure 4: Plasma SARS-CoV-2 RNA levels are not significantly correlated with SARS-CoV-2-specific neutralizing antibody levels but are correlated with multiple host-response inflammatory biomarkers in hospitalized patients. Correlations between SARS-CoV-2 RNA levels and anti SARS-CoV-2 neutralizing antibodies measured by plaque reduction neutralization titer (PRNT) assay (A), or the inflammatory biomarkers IL-8, IL-6, procalcitonin, suppressor of tumorigenicity 2 (ST-2), IL10 and pentraxin 3 measured in the plasma of COVID-19 inpatients (B). Red dots represent non-ICU patients and blue dots represent ICU patients. Undetected values are represented by open circles and graphed as one half the LLOD.

Figure 1



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Figure 2



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Figure 3

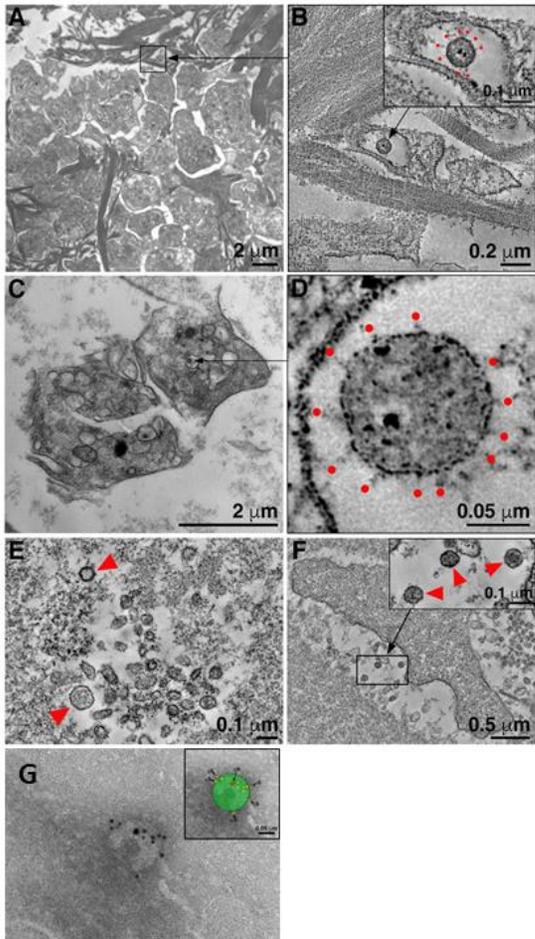


Figure 4

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