

Delayed Mucosal Antiviral Responses Despite Robust Peripheral Inflammation in Fatal COVID-19

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Background. While inflammatory and immune responses to severe acute respiratory syndrome coronavirus 2 (SARS-CoV-2) infection in peripheral blood are extensively described, responses at the upper respiratory mucosal site of initial infection are relatively poorly defined. We sought to identify mucosal cytokine/chemokine signatures that distinguished coronavirus disease 2019 (COVID-19) severity categories, and relate these to disease progression and peripheral inflammation.

Methods. We measured 35 cytokines and chemokines in nasal samples from 274 patients hospitalized with COVID-19. Analysis considered the timing of sampling during disease, as either the early (0–5 days after symptom onset) or late (6–20 days after symptom onset) phase.

Results. Patients that survived severe COVID-19 showed interferon (IFN)-dominated mucosal immune responses (IFN- γ , CXCL10, and CXCL13) early in infection. These early mucosal responses were absent in patients who would progress to fatal disease despite equivalent SARS-CoV-2 viral load. Mucosal inflammation in later disease was dominated by interleukin 2 (IL-2), IL-10, IFN- γ , and IL-12p70, which scaled with severity but did not differentiate patients who would survive or succumb to disease. Cytokines and chemokines in the mucosa showed distinctions from responses evident in the peripheral blood, particularly during fatal disease.

Conclusions. Defective early mucosal antiviral responses anticipate fatal COVID-19 but are not associated with viral load. Early mucosal immune responses may define the trajectory of severe COVID-19.

Keywords. COVID-19; SARS-CoV-2; virus; cytokine; chemokine; mucosa; airway; nose; lung.

Immunopathogenesis is a dominant feature of severe coronavirus disease 2019 (COVID-19) and hospitalized patients with established disease benefit from steroidal and anti-inflammatory therapies. In late-stage disease, immunopathogenesis is increasingly well characterized but less is known about early mucosal immune responses. In respiratory viral infections the upper respiratory tract (URT) is considered the site of initial viral replication, with preexisting adaptive immunity preventing or limiting infection [1]. Interferons (IFNs) and innate immune

effector cells provide the next layer of protection and are followed by adaptive T- and B-cell responses [2–4]. Severe acute respiratory syndrome coronavirus 2 (SARS-CoV-2) infection has been associated with an inadequate, delayed, or prolonged innate response, which can in turn delay adaptive responses [4, 5].

The value of immunomodulation in COVID-19 was first observed as reduced 28-day mortality following administration of dexamethasone to patients receiving oxygen or supportive ventilation [6]. Inhibition of interleukin 6 (IL-6) with monoclonal antibodies further demonstrated the benefit of immunosuppressive therapies in COVID-19 [7]. An alternative to immunosuppression of established disease is the enhancement of protective immune responses, and interventions prior to or during early hospitalization are desirable. Disruption of viral replication has been studied for this aim; however, the antiviral molnupiravir performs no better than placebo at preventing hospitalizations within at-risk groups [8]. Symptomatic non-hospitalized SARS-CoV-2 patients treated <5 days after symptom onset with the anti-SARS-CoV-2 monoclonal sotrovimab demonstrated a reduction in subsequent hospitalizations [9], supporting the principal that early intervention may reduce

Received 07 September 2023; editorial decision 11 December 2023; accepted 21 December 2023; published online 22 December 2023

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The Journal of Infectious Diseases®

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severity. However, antivirals and monoclonals risk decreasing efficacy due to viral escape mutations. Additionally, whilst higher viral load might be reasonably thought to influence severity, the relationship between URT viral load and severity is unclear [10–12]. Boosting host antiviral responses with pegylated IFN- λ within 7 days of symptom onset was effective in older participants at higher risk of severe disease [13]. While protective and harmful immune responses during COVID-19 are well described in blood, human mucosal immune responses during SARS-CoV-2 infection are relatively understudied. This has limited the development of immunomodulatory therapies that could enhance protective mucosal responses, inhibit immunopathogenesis, or define early prognostic markers.

The interval between SARS-CoV-2 exposure and symptom onset has been estimated at 5 days, although this shortened as viral variants adapted to human transmission [14]. Therefore, the symptomatic period has been considered to transition from a virus-initiated early viral phase (<5 days of symptoms) to an inflammatory phase [15]. The nasal mucosa offers a uniquely accessible window into the respiratory tract and, unlike lower airway sampling, can be performed repeatedly in large cohorts, enabling the characterization of rare disease outcomes. We used nasosorption sampling in a large prospective multicenter cohort hospitalized with COVID-19 to investigate the immune response in the upper airway and compared these responses to peripheral blood [16]. We now describe the temporal pattern of responses in participants of diverse severity, highlighting initial transient mucosal hyporesponsiveness in participants that progress to fatal disease.

METHODS

Study Design

The International Severe Acute Respiratory Infection Consortium (ISARIC) World Health Organization (WHO) Clinical Characterization Protocol for Severe Emerging Infections in the UK (CCP-UK) is a prospective cohort study of patients hospitalized with COVID-19, with recruitment across 258 hospitals in England, Scotland, and Wales (National Institute for Health Research Clinical Research Network Central Portfolio Management System ID, 14152) [17]. The protocol, revision history, case report form, patient information leaflets, consent forms, and details of the Independent Data and Material Access Committee are available online [18]. This was a prepositioned pandemic preparedness study with urgent public health research status [17]. Additional detail on the study design and analyses can be found in the [Supplementary Materials](#).

RESULTS

Elevated Mucosal Proinflammatory Cytokine Levels in Severe and Fatal COVID-19

Prepandemic healthy controls (HCs, $n = 25$) and patients hospitalized with COVID-19 within 20 days of symptom onset

($n = 274$) provided nasal mucosal samples ([Supplementary Table 1](#)). Patients were categorized into 3 groups based upon peak severity using the WHO clinical progression scale [19]: moderate disease ($n = 142$) encompassing no oxygen therapy (WHO score 4) and oxygenation by mask or nasal prongs (WHO score 5); severe disease ($n = 92$) including noninvasive ventilation or high-flow nasal cannula oxygenation (WHO score 6) and invasive mechanical ventilation (WHO scores 7–9); and fatal disease (WHO score 10; $n = 40$). In agreement with the wider ISARIC4C cohort [20], fatal outcome was associated with older age and male sex ([Supplementary Table 1](#)).

To identify associations between severity and nasal cytokines/chemokines, K-means clustering and principal component analysis (PCA) were performed ([Figure 1A](#) and [Supplementary Figure 1A–C](#), respectively) for HCs and 215 participants with complete data (moderate $n = 103$, severe $n = 59$, fatal $n = 28$) sampled ≤ 20 days after symptom onset. Clustering identified 2 groups of participants (A and B), with cluster A having more severe and fatal peak-severity participants ([Figure 1A](#)). Cluster A had elevated chemokines (eg, CCL2 and CCL4), inflammatory cytokines (eg, IFN- γ , IL-2, IL-6, tumor necrosis factor- α [TNF- α], IL-1 β , and IL-12p70), and the anti-inflammatory cytokine IL-10 (marker cluster 1). PCA showed a concentrated group of HCs and groups of patients with COVID-19 that diverged from HCs in PC1 (explaining 50.4% of variance) and PC2 (explaining 8.1% of variance) with greater peak severity and severity at time of sampling ([Supplementary Figure 1A and 1B](#), respectively). Loading values for PC1 and PC2 indicated IL-2, IL-12p70, TNF- α , IL-1 β , and IFN- γ made strong contributions to this variance ([Supplementary Figure 1C](#)). These cytokines and chemokines were closely correlated, along with other markers in cluster A ([Supplementary Figure 1D](#)).

Despite the enrichment of patients with higher disease severity in cluster 1, this cluster included many moderate-disease patients. Similarly, cluster 2 included some fatal cases, although most had moderate disease at time of sampling ([Figure 1A](#)). These unsupervised analyses of mucosal cytokine and chemokine levels from patients hospitalized with COVID-19 therefore indicated proinflammatory markers were associated with higher disease severity, and that the timing of sample collection during disease may influence cytokine and chemokine levels.

Mucosal Responses in COVID-19 Are Dominated by IFN- γ and IL-2

To define the association of individual mucosal immune markers with COVID-19 severity, levels in the first sample per participant were directly compared between peak-severity groups and HCs. This highlighted increases in a range of cytokines, including IFN- γ , IL-2, IL-12p70, IL-10, and IL-4 in moderate ($n = 142$), severe ($n = 92$), and fatal ($n = 40$) peak-severity groups, relative to HCs ([Figure 1B–D](#), respectively). Analysis of individual markers demonstrated considerable overlap

between peak-severity groups in many cytokines and chemokines, including IFN- γ , IL-2, and IL-10 (Figure 1E–M and Supplementary Figure 2). Levels of many markers were higher in the severe group, relative to moderate, but median levels in the fatal group were commonly equivalent to, or lower than, severe. Five markers were decreased in the moderate group, relative to HCs; angiopoietin-2, A proliferation-inducing ligand (APRIL/TNFSF13), fibroblast growth factor-basic (FGF-basic), D-dimer, and matrix metalloproteinase (MMP-1). No nasal cytokines or chemokines were significantly different between severe and fatal groups, in contrast to our previous observations in plasma [16], indicating that patients that would succumb to COVID-19 had equivalent mucosal inflammation to those that would survive severe disease.

Equivalent Viral Loads Between Peak-Severity Groups

We next determined whether differences in mucosal inflammation between severity groups could be accounted for by viral load. Nasal swabs collected ≤ 20 days after symptom onset showed equivalent viral loads between peak-severity groups (moderate $n = 56$, severe $n = 14$, fatal $n = 28$; Figure 2A). Relating these data to symptom duration at the time of sampling indicated no large-scale differences between peak-severity groups over the course of infection (Figure 2B). Nasal viral swabs collected at the same time as nasosorption sampling from 32 patients ($n = 18$ moderate, $n = 6$ severe, and $n = 8$ fatal peak severities) also showed no significant differences in viral load between severity groups (Figure 2C), or over time (Figure 2D). Viral loads also did not significantly correlate with contemporaneous nasosorption cytokine/chemokine levels (Figure 2E). These data indicated that viral load is unlikely to account for the differences in the scale and nature of the mucosal immune response between severity groups.

Longitudinal Nasal Sampling Demonstrates a Limited Early Mucosal Response in Fatal COVID-19

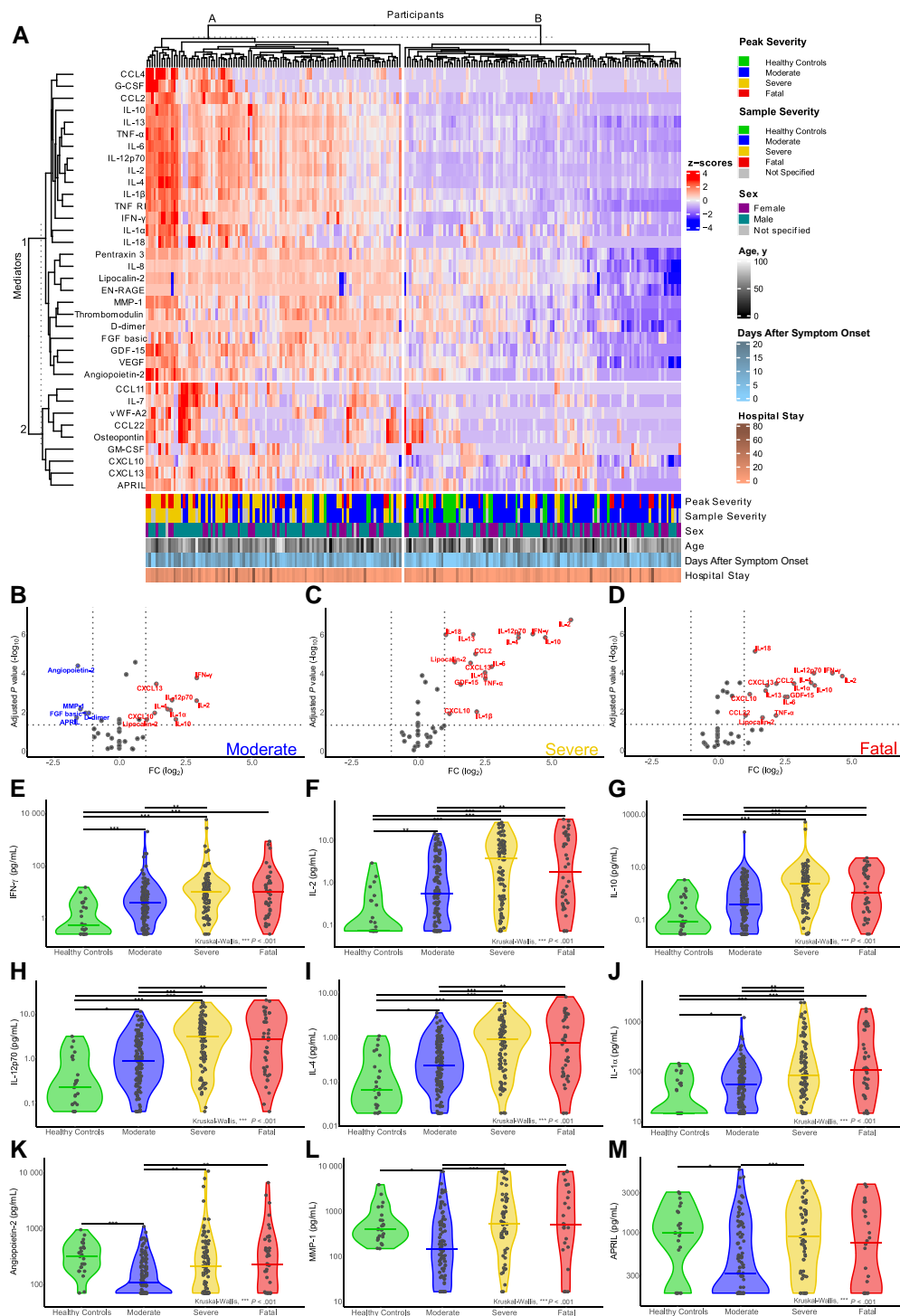
Given the indication that severity at the time of sampling might be associated with mucosal marker levels (Figure 1A), we studied the kinetics of nasal cytokines and chemokines between peak-severity groups. Sequential nasal samples from 153 patients ($n = 115$ with 2 repeat samples; $n = 34$ with 3 repeat samples; $n = 4$ with 4 repeat samples, totaling 348 samples; Supplementary Table 2) demonstrated that median levels of IFN- γ , IL-2, IL-10, IL-12p70, IL-4, and IL-1 α were low in fatal outcome participants in the first days after symptom onset, before climbing to a peak between symptom days 15 and 20 (Supplementary Figure 3). By contrast, nasal cytokine and chemokine levels in the moderate and severe peak-severity groups changed less over time.

To determine whether cytokine and chemokine responses in fatal outcome participants were lower in the first days after symptom onset, we separated data into early (0–5 days after

symptom onset, “viral”) and inflammation-dominated late (6–20 days after symptom onset “inflammatory”) phases [15]. PCA demonstrated overlap between peak-severity groups during either viral or inflammatory phases (Supplementary Figure 4). However, only the antiviral markers IFN- γ , CXCL10, and CXCL13 were elevated in the moderate group viral phase relative to HCs (Figure 3A), along with decreases in 7 cytokines and chemokines predominantly associated with vascular function (eg, angiopoietin-2, thrombomodulin). In the inflammatory phase, this IFN-led response expanded to include inflammatory markers (eg, IL-1 α , IL-2, and IL-12p70; Figure 3B). A broader inflammatory state was evident during the viral phase in the severe outcome group, with IL-2, IL-10, and IFN- γ particularly increased, alongside IL-4, IL-12p70, and IL-1 α (Figure 3C). Furthermore, IL-6 and TNF- α , previously linked to severe disease in the circulation [16], were also elevated. These changes continued in the inflammatory phase (Figure 3D), indicating a stronger mucosal inflammatory response in severe disease than moderate and a relatively stable nature and scale of the mucosal immune response within the severe group. In contrast to the IFN-led early mucosal responses evident in moderate and severe groups, the fatal outcome group had nasal cytokine levels equivalent to HCs in the early viral phase (Figure 3E). After the absence of a discernible response during the viral phase in the fatal group, the inflammatory phase was associated with induction of a wide array of cytokines and chemokines like those in the severe group (Figure 3F). Analyses of individual marker levels between groups in the viral and inflammatory phases supported these differences in timing and breadth of mucosal responses (Figure 4 and Supplementary Figures 5 and 6). As an exploratory analysis, we determined the ratio of viral load to mucosal CXCL10 levels (as a measure of IFN activity) where data were available from contemporaneous samples ($n = 36$). Stratification of these data by severity group and disease phase demonstrated lower levels (indicating low CXCL10 levels for a given viral load) in the fatal viral phase group, although this did not achieve statistical significance relative to other groups owing to the small group sizes (Supplementary Figure 7). These analyses indicated a limited mucosal response in early disease that would progress to fatal outcomes, in contrast to a largely IFN-dominated early response in those that will survive hospitalization with COVID-19, followed by a delayed but robust inflammatory response.

Robust Peripheral Inflammation in the Early Stages of Fatal COVID-19

To determine if differences between compartments were evident, nasal data were compared to our previously reported blood data [16], selecting for plasma samples collected ≤ 20 days after symptom onset ($n = 416$), comprising moderate ($n = 210$), severe ($n = 150$), and fatal ($n = 56$) peak-severity groups. To align with the nasal analysis, plasma cytokine data



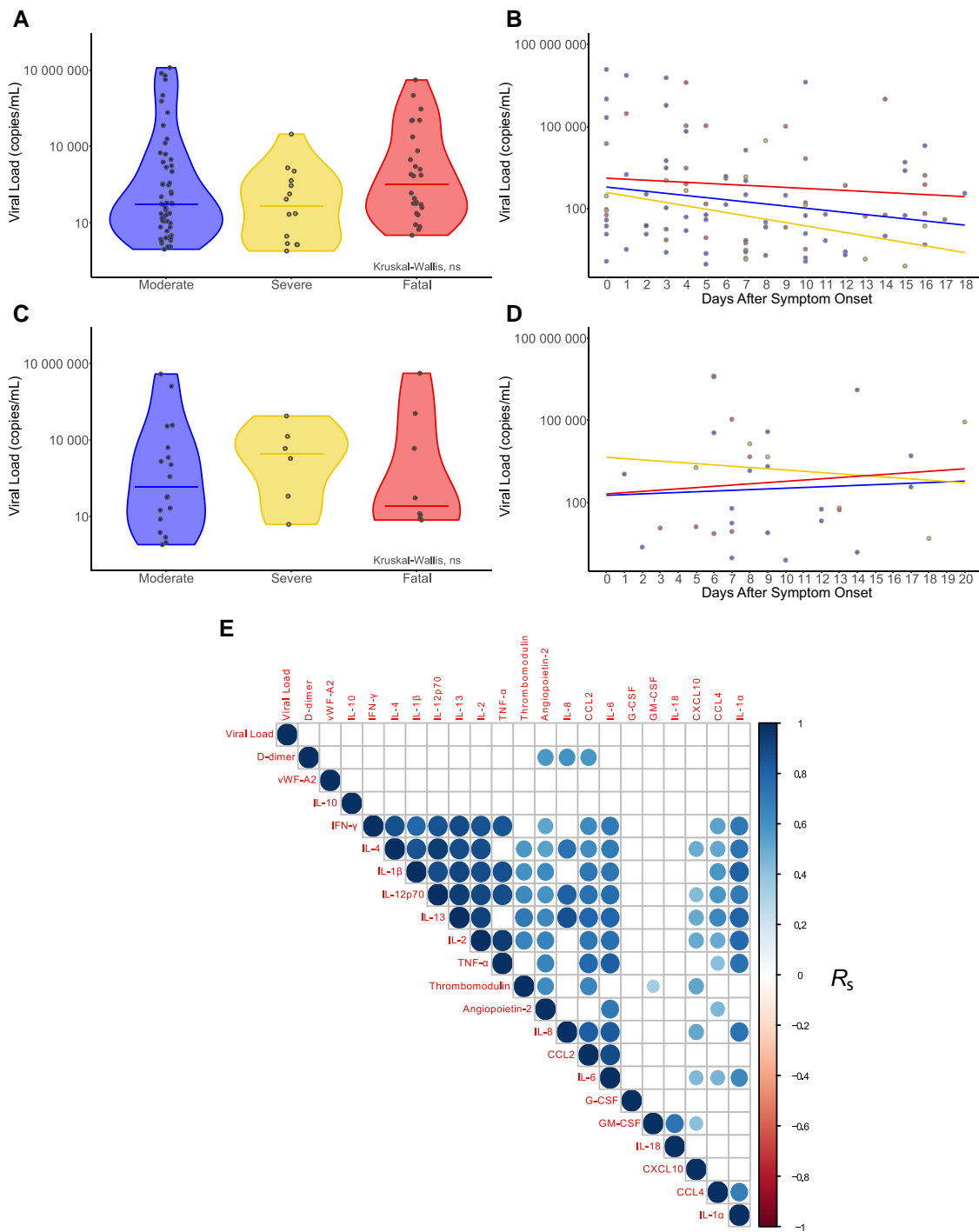


Figure 2. Nasal viral load was not associated with peak COVID-19 severity or nasal marker levels. *A*, Viral load quantified by RT-qPCR on nasal swabs from patients with COVID-19 (moderate $n = 56$, severe $n = 14$, fatal $n = 28$) taken 0–20 days after symptom onset. *B*, Viral load data aligned with the duration of symptoms at the time of sampling (days after symptom onset). A subset of these participants (moderate $n = 18$, severe $n = 6$, fatal $n = 8$) had viral load data and time-matched nasosorption cytokine and chemokine data: (*C*) viral load grouped by peak COVID-19 severity; and (*D*) viral load data aligned with duration of symptoms. *E*, Hierarchically clustered correlation matrix of nasal cytokines and chemokines and nasal viral loads, ranked using the Spearman rank correlation coefficient (R_s). Correlations were corrected for multiple testing and nonsignificant correlations are denoted by empty boxes. *B* and *D*, Linear regression lines for moderate, severe, and fatal peak COVID-19 severity groups. Abbreviations: COVID-19, coronavirus disease 2019; G-CSF, granulocyte-colony-stimulating factor; GM-CSF, granulocyte-macrophage colony-stimulating factor; IFN- γ , interferon- γ ; IL, interleukin; ns, not significant; RT-qPCR, reverse transcription quantitative polymerase chain reaction; TNF- α , tumor necrosis factor- α ; vWF-A2, von Willebrand factor-A2.

was normalized to HCs ($n = 15$) and comparisons made between viral and inflammatory phases (Supplementary Figure 8 and Supplementary Table 3), demonstrating little change in the nature or scale of peripheral inflammation between early and later stages of COVID-19.

To directly compare responses between nasal and plasma compartments, median levels of each marker in each severity group are shown as fold change relative to HC levels for each compartment (Figure 5). The viral phase of moderate participants showed prominent increases in plasma IL-10, IL-8, and angiopoietin-2, while IFN- γ and CXCL10 increases relative to HCs were similar between nasal and plasma compartments (Figure 5A and Supplementary Figure 8A). These were similar in the inflammatory phase for moderate participants (Figure 5B and Supplementary Figure 8B). In the severe group, plasma IL-6 elevations became more pronounced, during both viral and inflammatory phases (Figure 5C and 5D, respectively), while a robust elevation in nasal IL-2 was not evident in the plasma. Like the moderate group, neither nasal nor plasma cytokine and chemokine profiles in the severe group changed notably between the early viral and later inflammatory phases.

Plasma marker levels in the fatal group were similar to severe (Supplementary Figure 8); however, the nasal cytokine/chemokine response was relatively muted (Figure 5E). In contrast to the moderate and severe groups, the nasal marker profile in the fatal group expanded between the viral and inflammatory phases (Figure 5F). Interestingly, levels of IL-1 β and IL-18 were elevated in nasal samples of the inflammatory phase of both severe and fatal participants but were similar to HC levels in plasma (Figures 5D and 5F).

Together, this demonstrated that IFNs and IFN-driven chemokines dominate the nasal and plasma immune response to COVID-19. In severe disease during both the viral and inflammatory phases, IL-2 dominated the response in the nose, while IL-6 increased in the plasma and IFN- γ and IFN-induced chemokines were evident in both compartments. In fatal cases during the early viral phase, the nasal immune response was diminished relative to those that would survive COVID-19; however, the plasma inflammatory response was robust.

DISCUSSION

This is the first large-scale multicenter study of respiratory mucosal inflammation during hospitalization with COVID-19, recruiting patients early in disease. Recruitment was before SARS-CoV-2 vaccination, so reflects primary infections in naive individuals. Fatal COVID-19 was marked by a limited early mucosal immune response that contrasted with the robust IFN-led response in milder disease. This deficient mucosal response contrasted with robust inflammation in peripheral blood from the earliest stages of fatal disease. Therefore, a

weak early mucosal response despite robust peripheral inflammation was associated with mortality.

Weak early mucosal IFN responses might be expected to result in elevated viral load. However, viral loads were equivalent between peak-severity groups, in agreement with larger studies [11], and were not associated with mucosal cytokine/chemokine levels. Progressive inflammatory responses in the URT may therefore represent local immune dysfunction, rather than a loss of control over viral replication. Viral clearance rates are slower in symptomatic individuals [21] and as such, longitudinal analyses of viral kinetics may more closely associate with mucosal immune responses. Self-reported symptom durations are subjective and our definition of the viral phase (0–5 days of symptoms) may be influenced by this. Pseudotime analyses using sequential viral load measurements per participant offer one opportunity to align biological data to features of viral replication that may better reflect the duration of infection. However, our viral load data were insufficient to perform such analyses, while variance in viral clearance owing to differences in immune responses can confound derivation of pseudotime durations [11, 22].

Induction of IL-2 in the mucosa across severity groups may result from local T-cell activity, potentially fitting with blood lymphopenia in severe disease due to mucosal trafficking of peripheral T cells. Unlike the blood, mucosal IFN- γ and IL-2 levels plateaued between severe and fatal COVID-19 groups in late disease. In line with these data, aberrant macrophage activation and impaired T-cell responses in diseased lungs [23], an inadequate CD8⁺ T-cell response in fatal pneumonia, poor viral regulation [24], and CD8⁺ T-cell lymphopenia are associated with severe disease [24, 25]. The early abundance of IFN- γ suggests a type I (including Th1) skewed mucosal response in milder disease, while elevations in type II cytokines like IL-13 (linked to hyaluronan synthesis and severe disease [26]) in early severe disease suggest this skewing could change in more severe disease. In contrast to differences in the early viral phase, the nasal inflammatory-phase response in the fatal group was similar in nature and scale to severe participants, suggesting that early activation of mucosal immune responses may influence disease trajectory.

Some markers were similar between compartments; however, IL-18 and IL-1 β were markedly elevated in inflammatory phase nasal samples from severe and fatal groups, but not in plasma. This suggests inflammasome activation may be occurring in the airway during severe COVID-19 [27]. Nasal granulocyte-macrophage colony-stimulating factor (GM-CSF) was increased with no distinction between COVID-19 severity groups, in contrast to plasma GM-CSF (and IL-6) levels, which scale with severity [16]. Levels of mucosal IL-6 and GM-CSF therefore offer less distinction between severity groups than equivalent peripheral blood measures, highlighting common and unique features of immune responses between compartments.

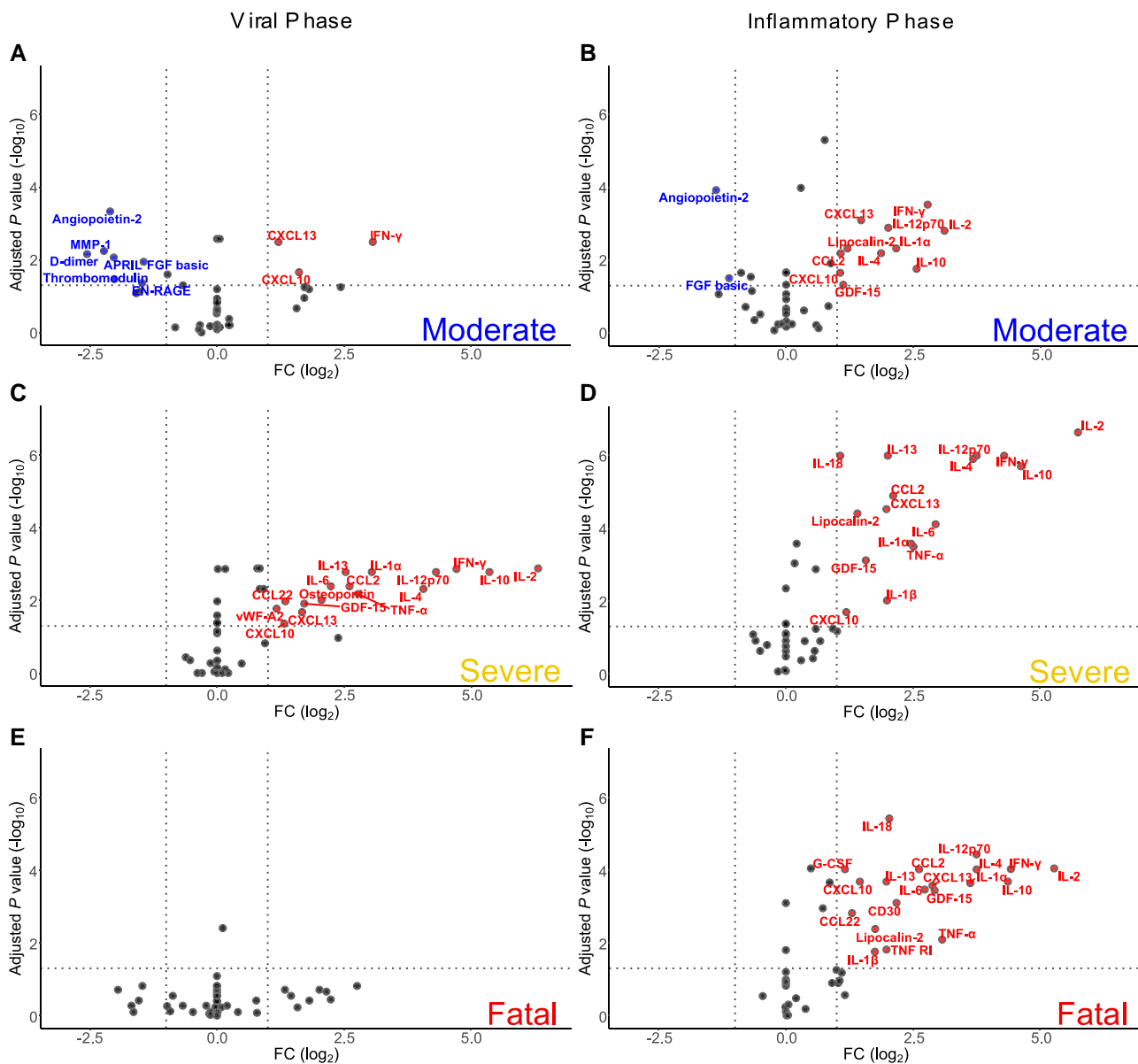


Figure 3. A muted early mucosal immune response was associated with fatal COVID-19. Cytokine and chemokine levels in nasal samples were compared to healthy control ($n = 25$) levels for each COVID-19 patient time group: (A) moderate, viral phase (0–5 days after symptom onset; $n = 44$); (B) moderate, inflammatory phase (6–20 days after symptom onset; $n = 98$); (C) severe, viral phase ($n = 18$); (D) severe, inflammatory phase ($n = 74$); (E) fatal, viral phase ($n = 9$); and (F) fatal, inflammatory phase ($n = 31$). A–F, Volcano plots with $-\log_{10}$ transformed false discovery rate adjusted Wilcoxon rank-sum P values (horizontal line at cutoff $P \geq .05$) plotted against \log_2 fold changes relative to healthy controls (vertical lines at cutoffs ≤ -2 and ≥ 2 fold change). Abbreviations: APRIL, A proliferation-inducing ligand; COVID-19, coronavirus disease 2019; EN-RAGE, Extracellular newly identified receptor for advanced glycation end products/S100A12; FGF, fibroblast growth factor; GDF-15, growth differentiation factor 15; IFN- γ , interferon- γ ; IL, interleukin; MMP-1, matrix metalloproteinase-1; TNF- α , tumor necrosis factor- α ; vWF-A2, von Willebrand factor-A2.

A deficient IFN response has been associated with COVID-19 [28], with different mechanisms hypothesized. Firstly, the apparent lack of early IFN-centered mucosal responses in fatal disease may be attributed to age-related immunosenescence [29], which is a therapeutic target in COVID-19 [30]. This attribution is supported by the older age of our fatal outcome group, and the risk associated with older age in COVID-19 [22]. Additionally, IFN-neutralizing autoantibodies associated with severe COVID-19 [31] may stall early mucosal IFN-centered responses,

encouraging progression to pathologic inflammatory responses. Expression of the IFN-induced transcript *IFI27* in peripheral blood has been linked to protection from disease in presymptomatic, asymptomatic, and abortive infections [25, 32, 33]. The weak IFN response in the mucosa may be a consequence of limited type I/III IFN expression in airway epithelial cells following SARS-CoV-2 infection [34] (despite a strong inflammatory response) and may evidence the ability of SARS-CoV-2 to repress IFN responses, but does not explain why this ability

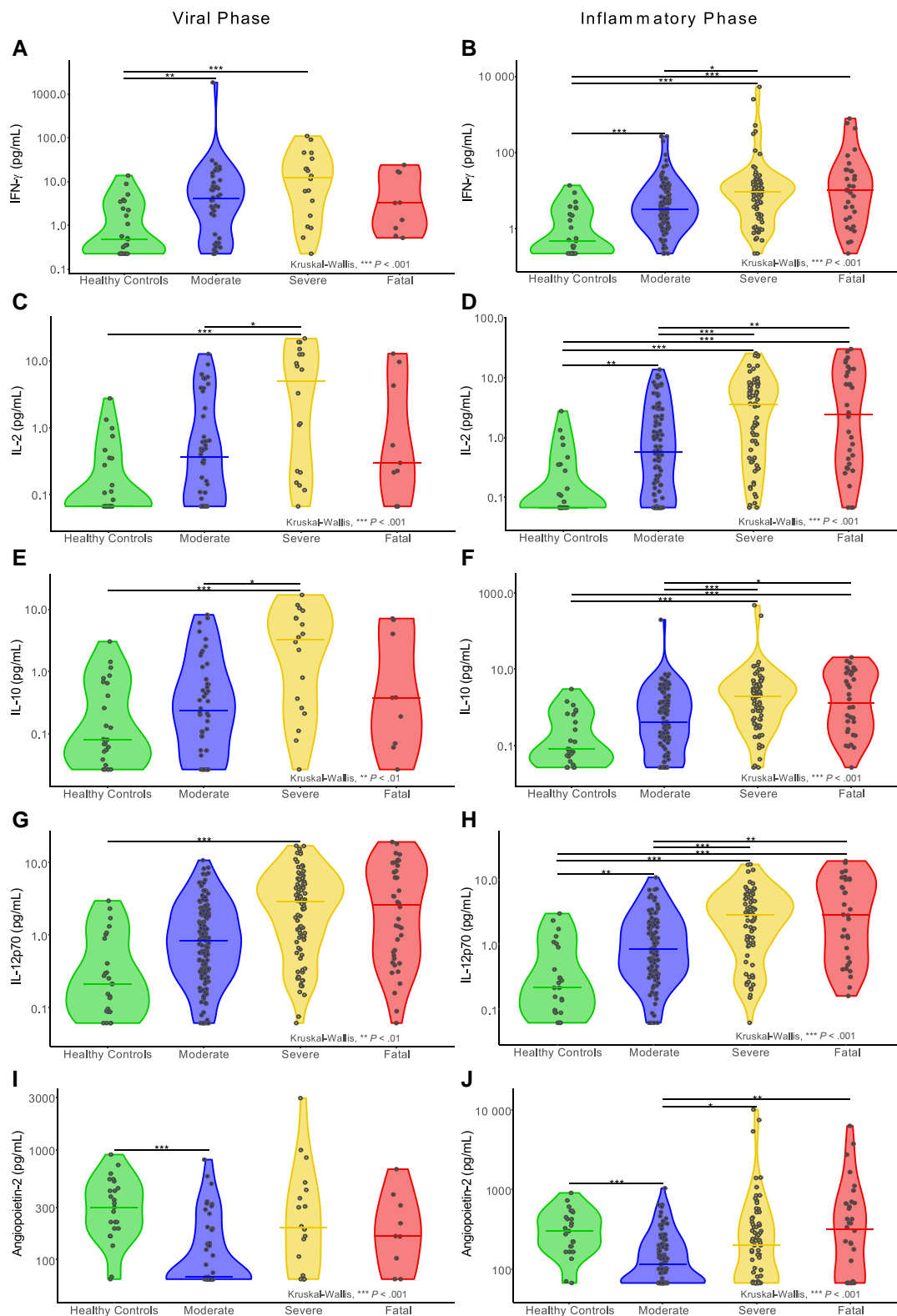


Figure 4. Cytokine and chemokine levels during the viral and inflammatory phases between peak-severity groups. Individual markers' particular distinctions between each COVID-19 peak-severity group and healthy controls, displayed by viral phase (0–5 days after symptom onset) or inflammatory phase (6–20 days after symptom onset): (A) viral phase IFN- γ ; (B) inflammatory phase IFN- γ ; (C) viral phase IL-2; (D) inflammatory phase IL-2; (E) viral phase IL-10; (F) inflammatory phase IL-10; (G) viral phase IL-12p70; (H) inflammatory phase IL-12p70; (I) viral phase angiopoietin-2; and (J) inflammatory phase angiopoietin-2. All panels show group median levels as lines and significance levels determined using Kruskal-Wallis tests with Dunn P value correction. * $P < .05$, ** $P < .01$, *** $P < .001$. Abbreviations: COVID-19, coronavirus disease 2019; IFN- γ , interferon- γ ; IL, interleukin.

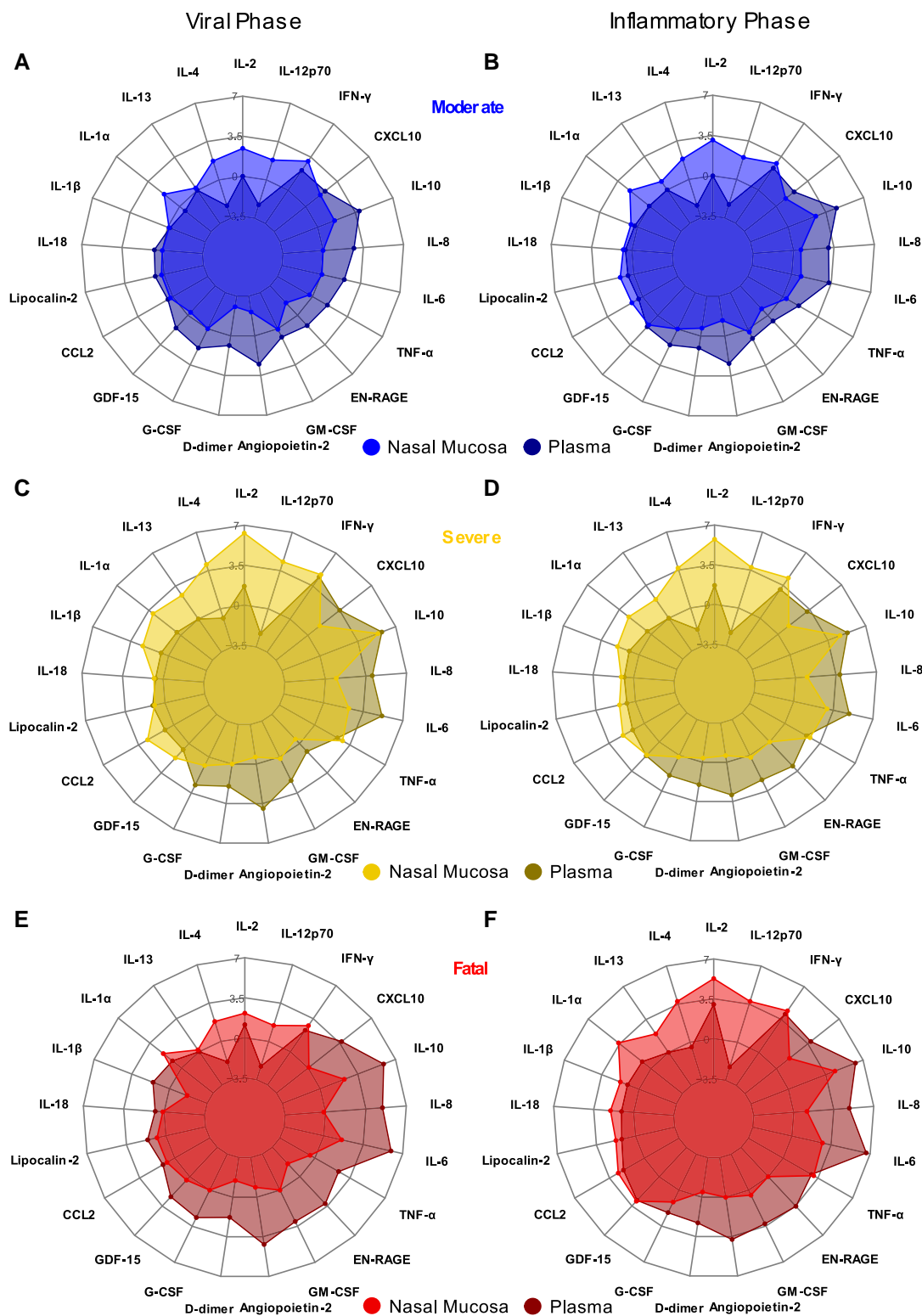


Figure 5. Pronounced blood plasma responses in the early stages of fatal COVID-19 despite weak mucosal responses. Median \log_2 fold-change values, relative to healthy control levels, for each cytokine or chemokine were contrasted between nasosorption samples (lighter shades) and plasma (darker shades) for each COVID-19 patient peak-severity group in viral (0–5 days after symptom onset) or inflammatory (6–20 days after symptom onset) phases: (A) moderate, viral phase; (B) moderate, inflammatory phase; (C) severe, viral phase; (D) severe, inflammatory phase; (E) fatal, viral phase; and (F) fatal, inflammatory phase. All panels show median \log_2 transformed cytokine fold-changes relative to healthy controls (healthy control levels therefore represented as the 0 line) for nasal samples and plasma samples by peak severity. Abbreviations: COVID-19, coronavirus disease 2019; EN-RAGE, Extracellular newly identified receptor for advanced glycation end products/S100A12; G-CSF, granulocyte-colony-stimulating factor; GDF-15, growth differentiation factor 15; GM-CSF, granulocyte-macrophage colony-stimulating factor; IFN- γ , interferon- γ ; IL, interleukin; TNF- α , tumor necrosis factor- α .

may manifest differently between severity groups when viral loads are equivalent. Levels of type I/III IFNs are low in mucosal fluid samples and were not quantifiable in our samples. Another explanation for the weak IFN response may be the abundance of polymorphisms in IFN-associated genes associated with COVID-19 [35–37], which may prevent or stall IFN responses. Together, these reports demonstrate the importance of IFN responses in limiting disease. Our data further this field by demonstrating that this deficient IFN response in the most severe cases of COVID-19 is most apparent in early mucosal responses.

The early anergic response in the nasal mucosa is reminiscent of the dysregulated immune response observed in blood during sepsis, combining elements of hyperinflammation alongside immunosuppression [38, 39]. Our data in fatal COVID-19 indicate that nasal mucosal responses are deficient even when hyperinflammation is established in blood. Such dysregulation was also apparent as inflammasome activation in our data, suggesting that severe COVID-19 is associated with failure to mount early IFN responses in the mucosa, alongside epithelial cell damage and accumulation of activated macrophages that result in delayed but excessive cytokine release [34, 40].

Our study is the largest to profile mucosal immune responses during severe COVID-19. Despite this scale, our sample size is limited in places, such as the number of longitudinal samples during early disease that progressed to fatal outcome. Respiratory sampling is challenging in patients with severe disease, resulting in the paucity of large-scale studies of mucosal responses in COVID-19, relative to the number of studies on blood responses. These difficulties were mitigated through our use of minimally invasive nasosorption sampling [41]. However, the URT cannot be assumed to fully represent the lower airway. As such, our observation of delayed IFN responses in fatal COVID-19 may not be recapitulated in the lower airway. Lower airway viral replication may similarly differ between severity groups in a way not evident in the URT; however, obtaining lower airway samples from milder cases of COVID-19 is challenging and sputum and nasal viral loads correlate closely [42].

Our viral and inflammatory phases could be considered arbitrary; however, we selected these time period classifications as they have been suggested to define the point at which initial antiviral responses transition to inflammatory responses [15]. Our cohort were recruited prior to vaccine rollout and were unlikely to have been previously infected, given our recruitment in early 2020. Vaccination, SARS-CoV-2 infection history, and viral evolution are all likely to change cytokine, chemokine, and immune cell responses [43], and our findings should be validated in a modern cohort.

Immune suppression with corticosteroids and monoclonal antibodies benefit patients with COVID-19 [6, 7]. Peripheral IFN- λ administration has not achieved widespread therapeutic use [13]. Similarly, nebulization of IFN- β to the airway showed

promise in phase 2 trials [44] but phase 3 trials recently failed to meet primary end points, despite showing promise in preventing disease progression [45]. Our data indicate that the window of opportunity for correcting mucosal IFN deficiencies may be in the first days of symptoms, so targeting such therapies to this window may enhance apparent efficacy. The RECOVERY trials of dexamethasone demonstrated greatest benefit >7 days after symptom onset [6], roughly aligning with our transition between viral and inflammatory phases. Similarly, anti-IL-6 is most effective in patients with elevated C-reactive protein [7], supporting the need to target therapies to distinct stages and phenotypes of disease.

We studied mucosal samples from SARS-CoV-2-naïve participants hospitalized early in the pandemic. These unique features enabled us to demonstrate early IFN-related mucosal immune responses in hospitalized COVID-19 patients who survived, that were absent in those that progressed to fatal disease. These data highlight the importance of early antiviral responses in the mucosa in protecting against severe COVID-19 and may guide the development and testing of therapeutics for the respiratory mucosa.

Supplementary Data

Supplementary materials are available at *The Journal of Infectious Diseases* online (<http://jid.oxfordjournals.org/>). Supplementary materials consist of data provided by the author that are published to benefit the reader. The posted materials are not copyedited. The contents of all supplementary data are the sole responsibility of the authors. Questions or messages regarding errors should be addressed to the author.

Notes

Acknowledgments. The ISARIC4C Investigators: Co-Lead Investigator (Consortium Lead and joint CI): J Kenneth Baillie. Co-Lead Investigator (Imperial College): Peter J. M. Openshaw. Colead Investigator (Protocol CI): Malcolm G. Semple. Coinvestigator: Beatrice Alex, Petros Andrikopoulos, Benjamin Bach, Wendy S. Barclay, Debby Bogaert, Meera Chand, Kanta Chechi, Graham S. Cooke, Ana da Silva Filipe, Thushan de Silva, Annemarie B. Docherty, Gonçalo dos Santos Correia, Marc-Emmanuel Dumas, Jake Dunning, Tom Fletcher, Christopher A. Green, William Greenhalf, Julian L. Griffin, Rishi K. Gupta, Ewen M. Harrison, Antonia Ying Wai Ho, Karl Holden, Peter W. Horby, Samreen Ijaz, Saye Khoo, Paul Klenerman, Andrew Law, Matthew R. Lewis, Sonia Liggi, Wei Shen Lim, Lynn Maslen, Alexander J. Mentzer, Laura Merson, Alison M. Meynert, Shona C. Moore, Mahdad Noursadeghi, Michael Olanipekun, Anthonia Osagie, Massimo Palmardini, Carlo Palmieri, William A. Paxton, Georgios Pollakis, Nicholas Price, Andrew Rambaut, David L. Robertson, Clark D. Russell, Vanessa Sancho-Shimizu, Caroline J. Sands, Janet

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Financial support. This work was supported by the National Institute for Health Research (NIHR) (grant number CO-CIN-01); the UK Research and Innovation (UKRI) Medical Research Council (MRC) (grant numbers MC_PC_19059 and MC_UU_00034/6); NIHR Health Protection Research Senior Investigator Award (to P. J. M. O.); the NIHR Imperial Biomedical Research Centre (grant number P45058); the Health Protection Research Unit (HPRU) in Respiratory Infections at Imperial College London and NIHR HPRU in Emerging and Zoonotic Infections at University of Liverpool, both in partnership with Public Health England, NIHR (grant number 200907); Wellcome Trust and Department for International Development (grant number 215091/Z/18/Z); the Bill and Melinda Gates Foundation (grant number OPP1209135); and the UK Coronavirus Immunology Consortium. Liverpool Experimental Cancer Medicine Centre provided infrastructure support (grant number C18616/A25153). L. T. is supported by the Wellcome Trust (grant number 205228/Z/16/Z) and by US Food and Drug Administration Medical Countermeasures Initiative (grant number 75F40120C00085). F. L. is supported by an MRC Clinical Training Fellowship (grant number MR/W000970/1). Funding to pay the Open Access publication charges for this article was provided by a Jisc Read and Publish deal for UK institutions, including Imperial College London.

Potential conflicts of interest. P. J. M. O. is the Imperial College Lead Investigator of the EMINENT consortium, supported by the Medical Research Council UK (MR/R502121/1; this grant supports collaborative testing of compounds developed by GlaxoSmithKline in UK universities); is on advisory boards for Affnivax, Oxford Immunotech, Nestle, and Pfizer in relation to immunity to viruses (fees paid to Imperial College London); and is on an advisory board for Janssen/J&J. L.T. has received consulting fees from the Medicines and Healthcare products

Regulatory Agency (MHRA); consulting fees from AstraZeneca and Synairgen, paid to the University of Liverpool; speaker's fees from Eisai, Ltd; and support for conference attendance from AstraZeneca. All other authors report no potential conflicts.

All authors have submitted the ICMJE Form for Disclosure of Potential Conflicts of Interest. Conflicts that the editors consider relevant to the content of the manuscript have been disclosed.

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