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Profound dysregulation of T cell homeostasis and function in patients with severe COVID-19

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Abstract
Background: Coronavirus disease 2019 (COVID-19) is caused by infection with severe acute respiratory syndrome coronavirus 2 (SARS-CoV-2) and shows a broad clinical presentation ranging from asymptomatic infection to fatal disease. A very prominent feature associated with severe COVID-19 is T cell lymphopenia. However, homeostatic and functional properties of T cells are ill-defined in COVID-19.

Methods: We prospectively enrolled individuals with mild and severe COVID-19 into our multicenter cohort and performed a cross-sectional analysis of phenotypic and functional characteristics of T cells using 40-parameter mass cytometry, flow cytometry, targeted proteomics, and functional assays.

Results: Compared with mild disease, we observed strong perturbations of peripheral T cell homeostasis and function in severe COVID-19. Individuals with severe COVID-19 showed T cell lymphopenia and redistribution of T cell populations, including loss of naïve T cells, skewing toward CD4+ T follicular helper cells and cytotoxic CD4+ T cells, and expansion of activated and exhausted T cells. Extensive T cell apoptosis was particularly evident with severe disease and T cell lymphopenia, which in turn was accompanied by impaired T cell responses to several common viral antigens.

Abbreviations: COVID-19, coronavirus disease 2019; CyTOF, cytometry by time-of-flight; Tfh, T follicular helper cell.

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Patients with severe disease showed elevated interleukin-7 and increased T cell proliferation. Furthermore, patients sampled at late time points after symptom onset had higher T cell counts and improved antiviral T cell responses.

Conclusion: Our study suggests that severe COVID-19 is characterized by extensive T cell dysfunction and T cell apoptosis, which is associated with signs of homeostatic T cell proliferation and T cell recovery.

KEYWORDS
COVID-19, lymphopenia, SARS-CoV-2, T cells

1 | INTRODUCTION

The global epidemic of severe acute respiratory syndrome coronavirus 2 (SARS-CoV-2), which is the causative agent of coronavirus disease 2019 (COVID-19), has resulted in almost 100 million confirmed cases and 2 million deaths worldwide as of January 2021. Patients with COVID-19 have a wide spectrum of symptoms ranging from asymptomatic infection to severe acute respiratory distress syndrome (ARDS).\(^1\)\(^-\)\(^5\) Advanced age and comorbidities are risk factors for the development of severe disease.\(^6\)\(^-\)\(^8\) Furthermore, individuals with severe disease have increased amounts and longer duration of SARS-CoV-2 viral shedding in the respiratory mucosa and of viral RNA in blood as compared to individuals with mild COVID-19.\(^9\)\(^-\)\(^12\) Several reports have demonstrated associations between severe disease and elevation of systemic inflammatory markers such as C-reactive protein (CRP), procalcitonin, and Interleukin-6 (IL-6).\(^6\)\(^,\)\(^13\)\(^-\)\(^17\) Taken together these data suggest that inefficient adaptive antiviral immunity and ensuing hyper-inflammation might underlie the pathogenesis of severe COVID-19.\(^18\)

T cells are central players in antiviral immunity. Effector T cells eliminate virus-infected cells, assist in innate antiviral response and support B cell responses, which culminate in the production of virus-specific antibodies.\(^12\) It has been convincingly shown that severe COVID-19 is associated with reduced amounts of CD3\(^+\) T cells in peripheral blood and that the extent of T cell decrease correlates with disease severity.\(^10\)\(^,\)\(^13\)\(^,\)\(^19\)\(^,\)\(^20\) The reduction in peripheral T cells appears to be particularly prominent within the CD8\(^+\) T cell compartment, but it remains unclear if this is due to trafficking of CD8\(^+\) T cells into tissues with ongoing SARS-CoV-2 replication, increased elimination of CD8\(^+\) T cells during COVID-19, or pre-existing low levels of CD8\(^+\) T cells in individuals who experience severe disease.

Besides a quantitative reduction, qualitative perturbations of the T cell compartment have been observed. Several studies have reported an increased frequency of activated T cell phenotypes,\(^21\) as well as increased expression of surface markers typical of T cell exhaustion, such as PD-1 and TIM-3.\(^19\)\(^,\)\(^22\) While a number of reports have dealt with T cell reactivity to SARS-CoV-2 proteins,\(^23\)\(^-\)\(^25\) little is known about how functional responses of T cells are affected during COVID-19.
To provide a detailed investigation of the peripheral T cell compartment, we performed mass cytometry, flow cytometry, targeted proteomics, and functional assays to phenotypically and functionally characterize the changes associated with symptomatic COVID-19 and relate them to disease severity. We observed peripheral T cell loss in both naïve and memory populations, especially among CD8+...
T cells, which was most prominent in severe disease. This was accompanied by increased T cell apoptosis, perturbations of the T cell compartment, and impaired T cell responses toward other viral antigens. Furthermore, we observed stronger T cell responses in patients sampled at later time points after onset of symptoms, which, together with the increased Interleukin-7 (IL-7) serum concentrations and evidence of substantial T cell proliferation, suggests a role for lymphopenia-induced proliferation in severe COVID-19.

2 | RESULTS

2.1 | Characteristics of COVID-19 patients and healthy subjects included in the cross-sectional study

To characterize the immune response associated with SARS-CoV-2 infection we conducted a prospective, observational, and cross-sectional study on symptomatic COVID-19 patients recruited at hospitals in the Canton of Zurich, Switzerland. The included patients were stratified based on clinical disease severity at the time of sampling (mild, \( n = 54 \); severe, \( n = 49 \)); a group of healthy controls was included for comparison (\( n = 27 \)) (Figure 1A). Patients were sampled at a single time point during their symptomatic phase (Figure 1A). Standard laboratory parameters and clinical characteristics of the included patients are presented in Table 1. In agreement with previous studies, we observed that patient age was positively correlated with disease severity (Figure 1B) and that males were overrepresented in the severe COVID-19 subgroup (Figure 1C).

We performed a comprehensive T cell characterization making use of a mass cytometry panel (Table S1 and Figure S1A–C) in a subset of patients (mild, \( n = 28 \); severe, \( n = 38 \), healthy, \( n = 22 \)). These data are available at http://dx.doi.org/10.17632/s84vd72fsz.1. T cell-related markers were visualized on t-distributed Stochastic Neighbor Embedding (t-SNE) maps focusing on a subset of T cells from each sample, as identified based on a random forest classification (Figure 1D, Figure S1D). By assessing the distribution of events on separate t-SNE maps for healthy controls, patients with mild disease and patients with severe disease, we observed differences between healthy donors and COVID-19 patients (Figure 1E). Notably, cells from healthy individuals showed accumulation in an area of the t-SNE map enriched for CD45RA, whereas events from patients were more represented in areas enriched for CD45RO, CD57, and Granzyme B (Figure 1D–E).

2.2 | Profound reduction in naïve and memory T cell populations in severe COVID-19

We determined the frequencies of naïve, central memory, effector memory, and terminal effector memory expressing CD45RA (TEMRA) CD4+ and CD8+ T cell subsets by manual gating among all T cells in COVID-19 patients and controls (Figure 2A,B, top panels). The frequency of the subsets within CD4+ or CD8+ cells is shown in stacked bar plots for individual patients (Figure 2A,B, bottom panels). As previously reported, patients with severe disease had decreased frequencies of naïve cells within the CD4+ and CD8+ T cell compartments compared to controls (Figure 2A–D). At the same time, the percentages of central memory CD4+ and CD8+ T cells were increased in severe COVID-19 (Figure 2C,D).

In order to investigate how the relative changes observed within the different T cell subsets related to absolute cell counts, we performed flow cytometry of whole blood. By measuring absolute cell counts for CD4+ and CD8+ T cells we could calculate absolute numbers for the different T cell subpopulations within our mass cytometry data set (Figure S2A). The marked reduction in naïve CD4+ and CD8+ T cells was confirmed by absolute counts and was especially pronounced for naïve CD8+ T cells (Figure 2C,D). In contrast, central memory and effector memory populations within the CD4+ T cell compartment also showed a reduction in COVID-19 patients compared to healthy controls (Figure 2C).

Absolute numbers of central memory CD8+ T cells, effector memory CD8+ T cells, and TEMRA CD8+ T cells were also reduced in patients with severe disease compared to controls (Figure 2D). Thus, in severe COVID-19, naïve T cell reduction was not accompanied by memory T cell expansion but rather by a slight decrease of the memory compartment, especially among CD8+ T cells. The impression of a relative increase in memory (especially central memory) populations was mainly created by the predominant reduction in naïve cells in the peripheral blood. Of note, the T cell reduction in peripheral blood was accompanied by strong T cell activation across all the main subsets (Figure S2B).

Patients with severe COVID-19 in our cohort were older than patients with mild disease (Figure 1B), which could account for some differences in the distribution of T cell populations as previously proposed. Generally, both lymphopenia and naïve T cell reduction correlated with age (Figure S3A). Since age and clinical severity are strongly linked, some of the alterations within the T cell compartment might be due to immunological aging. Upon stratification of patients according to age, we still detected differences between mild and severe COVID-19 patients in terms of total and naïve T cells, although the CD8+ T cell reduction in patients above 60 years of age was not statistically significant (Figure S3B). The same was true when we stratified individuals according to gender (Figure S3C). In our healthy control group, we saw a correlation between age and CD8+ T cell decline (Figure S4A) while this was not the case for CD4+ cells. Conversely, CD4+ T cells were reduced in male individuals compared to females (Figure S4B).

2.3 | Expansion of CD4+ T cells, with cytotoxic, activated and exhausted phenotypes in COVID-19

We next investigated how the distribution of CD4+ T cell subpopulations (Figure S5A) was altered during COVID-19. We saw a significant increase in T follicular helper cells and T regulatory cells, as well as terminally differentiated, activated, and exhausted T cells (Figure 3A).
TABLE 1 Clinical and laboratory characteristics of healthy subjects and COVID-19 patients

| Disease severity<sup>a</sup>                          | Healthy (n = 27) | Mild cases (n = 54) | Severe cases (n = 49) |
|-------------------------------------------------------|-----------------|---------------------|----------------------|
|                                                      | Grade at sampling – no. | Mild illness | Pneumonia | Severe pneumonia | Mild ARDS | Moderate ARDS | Severe ARDS |
|                                                      | Maximal grade – no. | 42 | 12 | 24 | 9 | 9 | 7 |

Demographical characteristics

|                                                      | Healthy (n = 27) | Mild cases (n = 54) | Severe cases (n = 49) |
|                                                      | Disease grade<sup>b</sup> | Age (median (IQR) [yrs]) | Gender (m/f) | Time since symptom onset (days) | Level of care at blood sampling time point | Outcome |
|                                                      | Mild illness | 36.0 (30.0–53.5) | 13/14 | - | Outpatient – no. (%) | Released/Recovered |
|                                                      | Pneumonia | 42.00 (30.25–57.75) | 28/26 | 9.96 ± 8.73 | Inpatient – no. (%) | - |
|                                                      |             | 69.00 (58.0–79.0)** |            | 18.55 ± 11.36* | Ward – no. (%) | 53 (98.1) |
|                                                      |             | 31/18 |            |             | ICU – no. (%) | Deceased |
|                                                      | Demographical characteristics |                     |                      |                      | | 1 (1.9) |
|                                                      | Demographical characteristics |                     |                      |                      | | 1 (2) |

Laboratory characteristics

|                                                      | Healthy (n = 27) | Mild cases (n = 54) | Severe cases (n = 49) |
|                                                      | C- reactive protein | Mean ± SD, [mg/L] | 1.20 ± 1.51 | 19.5 ± 40.09* | 106.71 ± 99.04** |
|                                                      | LDH(% of patients above reference value) | Mean ± SD, [%] | 5% | 16.7% | 79.1%* |
|                                                      | Hemoglobin | Mean ± SD, [g/L] | 141.5 ± 11.77 | 139.68 ± 17.43 | 131.10 ± 15.38** |
|                                                      | Absolute platelet count | Mean ± SD, [G/L] | 254.68 ± 56.45 | 211.21 ± 63.39* | 209.96 ± 109.21* |
|                                                      | Total white blood cell count | Mean ± SD, [G/L] | 5.86 ± 1.52 | 5.62 ± 2.50 | 7.14 ± 4.55 |
|                                                      | Monocytes | Mean ± SD, [G/L] | 0.45 ± 0.14 | 0.51 ± 0.32 | 0.45 ± 0.34 |
|                                                      | Neutrophils | Mean ± SD, [G/L] | 3.35 ± 1.15 | 3.42 ± 2.25 | 5.25 ± 3.34** |
|                                                      | Eosinophils | Mean ± SD, [G/L] | 0.15 ± 0.08 | 0.07 ± 0.08* | 0.03 ± 0.07** |
|                                                      | Basophils | Mean ± SD, [G/L] | 0.04 ± 0.02 | 0.02 ± 0.02* | 0.01 ± 0.02** |
|                                                      | Lymphocytes | Mean ± SD, [G/L] | 1.85 ± 0.65 | 1.56 ± 0.72 | 0.82 ± 0.45** |
|                                                      | CD3- CD56<sup>bright</sup> CD16<sup>dim</sup> NK cells | Mean ± SD, [cells/µL] | 10.5 ± 5.39 | 9.17 ± 5.63 | 6.14 ± 5.09** |
|                                                      | CD3- CD56<sup>dim</sup> CD16<sup>bright</sup> NK cells | Mean ± SD, [cells/µL] | 204.69 ± 110.88 | 191.98 ± 139.98 | 152.14 ± 99.75 |

Comorbidities

|                                                      | Healthy (n = 27) | Mild cases (n = 54) | Severe cases (n = 49) |
|                                                      | Hypertension – no. (%) | 4 (14.8) | 12 (22.2) | 29 (59.2)* |
|                                                      | Diabetes – no. (%) | 2 (7.4) | 7 (13) | 15 (30.6)* |
|                                                      | Heart disease – no. (%) | 1 (3.7) | 6 (11.1) | 22 (44.9)* |
|                                                      | Cerebrovascular disease – no. (%) | - | 2 (3.7) | 5 (10.2) |
|                                                      | Lung disease – no. (%) | 1 (3.7) | 6 (11.1) | 7 (14.3) |
|                                                      | Kidney disease – no. (%) | - | 9 (16.7) | 14 (28.6)* |

(Continues)
Interestingly, a population of Granzyme B+ terminally differentiated (CD28−) cells, compatible with cytotoxic CD4+ T cells, that was absent in healthy controls was strongly increased in COVID-19. This population likely corresponds to the one identified at the transcriptional level by others.28 Given the profound lymphopenia of severe COVID-19 patients (Figures S2A, S6A), we sought to relate our findings to absolute counts. This was especially important because a disproportionate reduction in specific populations could create the illusion of an expansion of other populations as observed for naïve and memory cells. By investigating absolute counts, we saw that the increased percentage of T follicular helper cells reflected a real expansion of this population in peripheral blood, likely contributing to the robust antibody responses observed in COVID-19,12 as well as healthy controls (Figure 3C). Indeed, we observed that the most prominent changes in patients with severe COVID-19 compared to healthy controls was the increase in cytotoxic CD4+ T cells, as well as the increase in terminally differentiated and exhausted cells. We next analyzed populations within the CD8+ compartment (Figure S5B) and observed an increase of activated and exhausted CD8+ T cells in terms of frequency (Figure 3D) and absolute counts (Figure 3E). CD8+ T cells with a cytotoxic phenotype (Granzyme B+, CD28−) were increased in percentage but not in absolute number (Figure 3D–F). Among CD8+ cells, the most prominent change observed was the increase in exhausted T cells, which also showed a strong difference between mild and severe patients (Figure 3F). PhenoGraph unsupervised clustering of T cell populations revealed a similar picture (Figure S7A–B).

2.4 T cell apoptosis and indirect signs of T cell migration in severe COVID-19

We next investigated apoptosis and cell migration as possible mechanisms contributing to peripheral T cell loss in patients with severe COVID-19. Several factors can contribute to T cell apoptosis...

| Disease severity | Healthy (n = 27) | Mild cases (n = 54) | Severe cases (n = 49) |
|------------------|------------------|---------------------|----------------------|
|                  | Mild illness     | Pneumonia           | Severe pneumonia     |
|                  |                  |                     | Mild ARDS            |
|                  |                  |                     | Moderate ARDS        |
|                  |                  |                     | Severe ARDS          |

| Disease grade   | Healthy (n = 27) | Mild cases (n = 54) | Severe cases (n = 49) |
|-----------------|------------------|---------------------|----------------------|
| Malignancy – no. (%) | 1 (3.7)         | 2 (3.7)             | 5 (10.2)             |
| Systemic Immunosuppression – no. (%) | -               | 3 (5.6)             | 5 (10.2)             |

**Treatment at sampling**

| Hydroxychloroquine – no. (%) | -               | 2 (3.7)             | 19 (38.8)*            |
| Remdesivir– no. (%) | -               | 3 (5.6)             | 10 (20.4)*            |
| Glucocorticoids – no. (%)2 | -               | -                  | 5 (10.2)*             |
| Lopinavir-Ritonavir– no. (%) | -               | -                  | 1 (2)                 |
| Tocilizumab – no. (%) | -               | -                  | 3 (6.1)               |
| Glucocorticoids pre-COVID – no. (%) | -               | 2 (3.7)             | 5 (10.2)             |
| Mycophenolate Mofetil– no. (%) | -               | 1 (1.9)             | -                     |
| Calcineurin Inhibitors – no. (%) | -               | 1 (1.9)             | 1 (2)                 |
| Azathioprine – no. (%) | -               | -                  | 2 (4.1)               |
| Leflunomide – no. (%) | -               | 1 (1.9)             | -                     |
| Mesalazine– no. (%) | -               | 1 (1.9)             | -                     |
| Methotrexate – no. (%) | -               | 1 (1.9)             | -                     |
| Rituximab – no. (%) | -               | 1 (1.9)             | -                     |

**Note:** Mann-Whitney-Wilcoxon test was used to test for differences between continuous variables adjusted for multiple testing using the Holm method. * Indicates significance (p-value threshold <.05) compared to the healthy, ** in the severe indicates significance in comparison to the healthy and the mild. Categorical variables were compared using Chi-square test, * indicates significance (p-value threshold <.05) overall.

**Abbreviations:** ARDS, acute respiratory distress syndrome; ICU, intensive care unit; IQR, interquartile range; LDH, Lactate Dehydrogenase.

2 COVID-19 disease severity at the time of blood sample collection. Mild illness and pneumonia are considered mild COVID-19 disease and severe pneumonia as well as any grade of ARDS are considered severe COVID-19 disease.

COVID-19 grade according to WHO guidelines, recorded at sampling and prospectively followed until recovery.

Glucocorticoids initiated as part of the COVID-19 treatment.
in severe COVID-19 including cytokine signaling, direct interaction of the virus with T cells via CD26 or CD147 and elevated plasma Fas ligand levels as described for SARS-CoV.29,30

Excessive pro-inflammatory cytokine signaling, especially mediated by TNF-α, can directly lead to T cell apoptosis.31 As TNF-α levels were considerably elevated in our cohort (Figure S8A) in agreement
with previous reports, we hypothesized that apoptosis could drive T cell loss during severe COVID-19 disease. We thus determined the percentage of apoptotic cells among the main CD4+ and CD8+ T cell subsets. We defined apoptotic cells as cells positive for cleaved caspase-3 and/or cleaved PARP, as cleavage of both of these substrates occurs during apoptosis and positivity for the cleaved form of these proteins can be used as evidence of an apoptotic state.

Indeed, we observed significant increases in the percentages of apoptotic cells among central and effector memory CD4+ T cells, as well as naive, central memory, and effector memory CD8+ T cells and...
Reduced in vitro T cell function in patients with COVID-19

We next investigated whether the observed changes within the T cell compartment associated with COVID-19 had an impact on T cell function. We took advantage of our clinically validated flow cytometric assay for specific cell-mediated immune responses in activated whole blood (FASCIA).42,43 This routine assay measures the ability of peripheral T cells in whole blood to form blasts in response to mitogens, super-antigens, and a selection of common viral antigens. In patients with severe COVID-19, we observed reduced blast formation upon stimulation with adenovirus, Cytomegalovirus (CMV), Herpes simplex virus 1 (HSV1), Herpes simplex virus 2 (HSV2) and Varicella Zoster Virus (VZV) in COVID-19 as compared to healthy controls or patients with mild disease (Figure 5A). The same tendency was not observed when blood cells were incubated with pokeweed mitogen or Staphylococcal super-antigens (SEA/SEB), but we did observe a reduction blast formation upon stimulation with concavalin A (Figure 5A). The discrepancy between different mitogens is difficult to interpret, as pokeweed mitogen and concavalin A are both plant lectins, known to induce mitosis in T cells, but their exact mechanism of action is not known. We next investigated whether the reduction in antiviral T cell responses was associated with the time between sampling and symptom onset in our cross-sectional study. Interestingly, we observed a positive correlation between blast formation and time after symptom onset upon stimulation with HSV1, HSV2, and adenovirus (Figure 5B and Figure S9A). A trend toward a positive correlation was also observed for CMV and VZV stimulation of samples from patients with severe COVID-19, but not for stimulation with mitogens or super-antigens (Figure 5B and Figure S9A). Taken together, these data suggest that antiviral T cell responses are impaired in patients with severe COVID-19 and that these responses tend to improve in patients sampled at later time points from symptom onset.

Reduced blast formation upon stimulation with specific viral antigens is likely mediated by a combination of factors, but reduced frequency of virus-specific memory T cells is likely to play a central role. In support of this, we found that blast formation positively correlated with absolute peripheral CD4+ and CD8+ T cell counts (Figure S9B.C). We therefore hypothesized that the improvement of T cell function at later stages of the infection might be partially due to reconstitution of the peripheral T cell compartment. Indeed, we observed higher absolute peripheral T cell counts in samples from patients with severe COVID-19 obtained at later time points after symptom onset as compared to samples obtained earlier in the disease course, especially
Figure 4: Severe COVID-19 is associated with lymphopenia, apoptosis and phenotypic changes of T cells. (A) Percentages of apoptotic (cleaved-PARP/cleaved Caspase 3) cells among CD4+ T cell subsets and CD8+ T cell identified with mass cytometry in healthy subjects and patients with mild and severe COVID-19 patients shown as individual dots. Box plots display median and interquartile ranges. Indicated p values were calculated with a Mann–Whitney–Wilcoxon test and adjusted for multiple comparisons with the Holm method. (B) Percentages of apoptotic (cleaved-PARP/cleaved Caspase 3) among CD4+ T cells and CD8+ T cell identified with mass cytometry in patients with mild illness vs. mild pneumonia. Indicated p values were calculated with a Mann–Whitney–Wilcoxon test. (C) CXCL9, CXCL10, CXCL11, and IFN-γ serum levels in healthy subjects and patients with mild and severe COVID-19 measured with an Olink proximity extension assay shown as individual dots. Box plots display median and interquartile ranges. Statistical testing was performed as in (A). (D) CXCR3 mean ion count (MIC) of CD4+ T cell subsets (top) and CD8+ T cell subsets (bottom) in healthy subjects and patients with mild and severe COVID-19. Statistical testing was performed as in (A). (E) Pearson correlation analyses among CXCR3, CXCL9, CXCL10, CXCL11, and IFN-γ levels, lymphocyte and T cell counts, and percentage of apoptotic cells in samples from all subjects.
for CD8+ T cells (Figure 5C). To explore whether T cell reconstitution was a potential mechanism, we investigated T cell proliferation in the different T cell populations. We could indeed observe increased frequencies of proliferating (Ki-67+) in multiple subsets of CD4+ and CD8+ T cells in COVID-19 patients, especially in patients with severe disease (Figure 5D and Figure S10A–B).

Given the extent of the lymphopenia in severe COVID-19 we hypothesized that lymphopenia-induced proliferation might play a role. IL-7 is known to be a critical homeostatic factor for T cells, and since IL-7 production by stromal cells is relatively constant, IL-7 serum levels are mainly regulated by its consumption by lymphocytes. In patients with severe disease, we observed higher serum IL-7 levels compared to those with mild disease and healthy controls (Figure 5E), in agreement with a previous report. Furthermore, IL-7 levels inversely correlated with the total number of CD3+, CD4+ and CD8+ T cells (Figure 5F). Taken together, these findings suggest that the lymphopenia in severe COVID-19 could result in a systemic IL-7 elevation, which in turn might contribute to the observed T cell proliferation.

### 3 | DISCUSSION

T cell lymphopenia and perturbations of T cell homeostasis are very prominent features of severe COVID-19, but their pathogenesis has not yet been fully elucidated. A better understanding of the T cell alterations occurring in severe COVID-19 can provide insight into important disease mechanisms and inform therapeutic strategies. We performed detailed investigations of relative and absolute changes to the peripheral T cell compartment in our well-characterized COVID-19 cohort. Our analysis revealed marked T cell loss across naïve and memory cells in the CD4+ and CD8+ T cell compartment in patients with COVID-19 compared to healthy controls. However, certain T cell populations such as cytotoxic, activated and exhausted cells were expanded, especially in severe COVID-19. We were able to identify apoptosis as a possible mechanism driving the lymphopenia and observed signs of T cell reconstitution at later time points from symptom onset.

The occurrence of peripheral lymphopenia has been described in several human acute respiratory viral infections. In severe COVID-19, the extent of lymphopenia is closely linked to disease severity and mortality. Since disease severity in COVID-19 is strongly associated with biological age, age-associated decline in lymphocyte counts could in part account for the observed lymphopenia. A recent study, which showed a strong correlation between T cell lymphopenia, diminished SARS-CoV-2-specific T cell responses and severe disease also suggested an association between age and decline in the fraction of naïve CD8+ T cells. Investigating the effect of age in our patient cohort poses a challenge, as this is strongly linked to disease severity. In our healthy control group, however, we saw a correlation between age and CD8+ T cell decline, while this was not the case for CD4+ cells. Despite association with disease severity and male gender, we did not observe CD8+ T cell reduction when comparing males to females among healthy controls, but saw a modest reduction of CD4+ T cells. Given the limited number of subjects, these data must be interpreted with caution, but it is conceivable that age and gender account for pre-existing alterations of the T cell compartment that influence the course of COVID-19 disease.

Within the T cell compartments, we saw a prevalent reduction of naïve T cells, which resulted in increased memory subsets percentages despite the slight contraction in absolute numbers. Whether the loss of naïve populations can be explained by the acquisition of a memory phenotype by virus specific cells or in an antigen independent way remains to be seen.

Another potential explanation for the loss of naïve cells might be selective or preferential death of these subsets. In this study we observed extensive T cell apoptosis in COVID-19, especially among CD8+ T cells, suggesting that apoptosis could be a central mechanism in the immunopathology of severe COVID-19. Apoptosis could be caused by the inflammatory microenvironment generated by SARS-CoV-2, although a direct interaction of the virus with T cells via CD147 or CD26 or perhaps even T cell infection cannot be excluded. In our study, we could not identify a temporal component to the increased apoptosis, but we observed signs of T cell recovery starting at day 20, suggesting that apoptosis might occur relatively early in the disease course.

Lymphocyte redistribution, that is, migration to inflamed tissues, can also be a cause of apparent peripheral lymphopenia. In our study, we found elevated amounts of CXCL9, CXCL10, and CXCL11. These chemokines are known to be produced in response to viral infection and are mainly responsible for T cell and NK cell recruitment to the site of infection. Together with the reduced surface expression of CXCR3, our data could suggest migration of cells expressing higher levels of CXCR3 to the tissue, accounting for their disappearance from the peripheral blood, although down-regulation of CXCR3 in response to its ligands or antigen activation cannot be excluded.

Based on our data, the changes in T cell populations in COVID-19 might be due to T cell apoptosis, migration, proliferation or differentiation. For example, expansion of T follicular helper cells might result from a combination of differentiation and proliferation, while contraction of Th1 could depend on migration and apoptosis in this population. Although migration and apoptosis are both possible mechanisms, higher T cell counts in the lung do not seem to correlate with disease severity. Furthermore, IL-7 elevation in severe disease likely results from global T cell loss, rather than T cell re-distribution or activation-induced down-regulation of the IL-7 receptor α subunit. Taken together, these findings suggest that apoptosis might be central to the development of lymphopenia in severe COVID-19.

When investigating the T cell function in COVID-19, we found reduced T cell responses to several viral antigens in severe disease. The most likely explanation for this finding is a reduction in the precursor frequency of memory cells specific for common antigens. A similar effect has recently been described for B cells in measles, where it has been linked to direct B cell infection and cell death. In
the measles studies, alteration of the B cell repertoire can last for years, whereas we observed an improvement of T cell function in patients sampled later in the disease courses (day 30–40), which occurred in parallel with recovery of T cell counts. This dynamic was present only in patients with severe disease, probably because the more severe lymphopenia had resulted in increased levels of IL-7.
which could in turn trigger lymphopenia-induced IL-7-mediated homeostatic proliferation, as reported for other viral infections.\textsuperscript{55}

Understanding the immunological mechanisms underlying severe COVID-19 disease is necessary for risk stratification and the development of interventional therapies, including those aimed at lymphopenia,\textsuperscript{56} and protective vaccines. Our study reveals perturbations within CD4\textsuperscript{+} and CD8\textsuperscript{+} T cell compartments, confirming the association between severe disease, age and T cell lymphopenia, and showing that the lymphopenia is likely partially mediated by a COVID-19 associated apoptotic T cell loss. The observed increased T cell apoptosis in severe disease is closely associated with a highly inflammatory innate immune response. Thus, our study highlights the potential of therapies targeting T cell dysregulation and excessive inflammation in possibly limiting the observed extensive T cell loss associated with severe COVID-19. One promising immunomodulatory therapeutic approach is the use of JAK inhibitors in patients with severe COVID-19. A recent randomized controlled trial with Baricitinib\textsuperscript{57} showed promising effects, especially in patients receiving high-flow oxygen or non-invasive ventilation. Further studies investigating how immunomodulatory therapies such as JAK-inhibitors affect the innate and adaptive immune responses in severe COVID-19 are needed.

4 | METHODS

4.1 | Subjects characteristics

Patients aged 18 years and older with symptomatic, RT-qPCR confirmed SARS-CoV-2 infection were recruited at four different hospitals in the Canton of Zurich, Switzerland, between April 2 and August 19 2020. Both hospitalized patients and outpatients were recruited into the study and all participants gave written informed consent. The study was approved by the Cantonal Ethics Committee of Zurich (BASEC 2016–01440). A more detailed description of the cohort is provided in the Appendix S1.

4.2 | Flow cytometry

For quantification of the main T cell subsets, blood samples were processed in the accredited routine immunology laboratory at University Hospital Zurich. Flow cytometry staining, assessment and analysis was done as established,\textsuperscript{58,59} using the reagents and methodology detailed in the Appendix S1.

4.3 | Mass cytometry analysis

Samples were pre-processed as described in the Appendix S1 and mass cytometry analysis was performed as previously described.\textsuperscript{17,60–67} A detailed description of the procedure is provided in the Appendix S1.

4.4 | Flow cytometric assay for specific cell-mediated immune responses in whole blood

Venous blood collected in sodium heparin tubes was diluted with RPMI 1,640 medium supplemented with 10% FBS, 100 IU/mL penicillin and 100 IU/mL streptomycin (all from Gibco). Blood cells were stimulated with pokeweed mitogen, Concanavalin A, Staphylococcus enterotoxins A and B, or antigens from varicella zoster virus (VZV), adenovirus, cytomegalovirus (CMV), herpes simplex virus 1 (HSV1), or herpes simplex virus 2 (HSV2) or left unstimulated for 7 days. Cells were then stained with live/dead fixable Aqua stain (Thermo Fisher, catalog number L34957) and with Cyto-Stat tetrachrome (containing FITC anti-CD45, PECy5 anti-CD3, PE anti-CD4, and ECD anti-CD8; Beckman Coulter, catalog number 660713). Data were acquired on a Navios flow cytometer and analyzed with Kaluza analysis software. Net stimulation was calculated by subtracting the percentage of CD3\textsuperscript{+} blasts over all lymphocytes in the unstimulated sample from their counterparts in stimulated samples.

4.5 | Cytokine measurements

Serum was collected in BD vacutainer clot activator tubes (Becton Dickinson). The samples were processed in an accredited immunology laboratory at the Department of Immunology of University Hospital Zurich. IFN-γ and TNF-α were quantified using an ELISA (R&D Systems), as previously established.\textsuperscript{68}

4.6 | Proteomics analyses

Heat-inactivated plasma samples were analyzed using the Olink® Proteomics 92-plex inflammation immunoassay. A brief description of the method is provided in the Appendix S1.
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CONFLICT OF INTEREST
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AUTHOR CONTRIBUTION
SA contributed to study design, patient recruitment, data collection, data analysis, and data interpretation. SC contributed to study design, data collection, data analysis, and data interpretation. CC and YZ contributed to patient recruitment, data collection and data analysis. MER, EB, AR, MS-HI, LCH, and DJS contributed to patient recruitment and clinical management. SS, AJ, and SC developed the CyTOF antibody panel and performed the CyTOF experiments. SA and JN wrote the manuscript with contribution by OB and BB. JN, OB, and BB contributed to study conception and design, data analysis and data interpretation. All authors reviewed and approved the final version of the manuscript.

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**SUPPORTING INFORMATION**

Additional supporting information may be found online in the Supporting Information section.

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