DOI: 10.1111/ene.15072

## ORIGINAL ARTICLE

european journal of neurology the official journal of the european academy of neurol

# Neurological symptoms and complications in predominantly hospitalized COVID-19 patients: Results of the European multinational Lean European Open Survey on SARS-Infected Patients (LEOSS)

Nina N. Kleineberg<sup>1,2</sup> I Samuel Knauss<sup>3,4</sup> | Eileen Gülke<sup>5</sup> | Hans O. Pinnschmidt<sup>6</sup> | Carolin E. M. Jakob<sup>7,8</sup> | Paul Lingor<sup>9</sup> | Kerstin Hellwig<sup>10</sup> | Achim Berthele<sup>11</sup> | Günter Höglinger<sup>12,13</sup> | Gereon R. Fink<sup>1,2</sup> | Matthias Endres<sup>3,14,15,16,17</sup> | Christian Gerloff<sup>5</sup> | Christine Klein<sup>18</sup> | Melanie Stecher<sup>7,8</sup> | Annika Y. Classen<sup>7,8</sup> | Siegbert Rieg<sup>19</sup> | Stefan Borgmann<sup>20</sup> | Frank Hanses<sup>21,22</sup> | Maria M. Rüthrich<sup>23,24</sup> | Martin Hower<sup>25</sup> | Lukas Tometten<sup>7</sup> | Martina Haselberger<sup>26</sup> | Christiane Piepel<sup>27</sup> | Uta Merle<sup>28</sup> | Sebastian Dolff<sup>29</sup> | Christian Degenhardt<sup>30</sup> | Björn-Erik O. Jensen<sup>31</sup> | Maria J. G. T. Vehreschild<sup>32</sup> | Johanna Erber<sup>33</sup> | Christiana Franke<sup>3</sup> | Clemens Warnke<sup>1</sup> | the LEOSS Study Group

<sup>1</sup>Department of Neurology, Faculty of Medicine and University Hospital Cologne, University of Cologne, Cologne, Germany

<sup>2</sup>Cognitive Neuroscience, Institute of Neuroscience and Medicine (INM-3), Research Centre Jülich, Jülich, Germany

<sup>8</sup>German Center for Infection Research (DZIF), Partner-Site Cologne-Bonn, Cologne, Germany

<sup>13</sup>German Center for Neurodegenerative Diseases (DZNE), Munich, Germany

<sup>14</sup>Center for Stroke Research Berlin, Berlin, Germany

<sup>15</sup>ExcellenceCluster NeuroCure, Berlin, Germany

<sup>17</sup>German Centre for Cardiovascular Research (DZHK), Partner Site Berlin, Berlin, Germany

<sup>18</sup>Institute of Neurogenetics, University of Luebeck and University Hospital Schleswig-Holstein, Campus Luebeck, Luebeck, Germany

<sup>19</sup>Division of Infectious Diseases, Department of Medicine II, Medical Centre, Faculty of Medicine, University of Freiburg, Freiburg, Germany

<sup>20</sup>Department of Infectious Diseases and Infection Control, Ingolstadt Hospital, Ingolstadt, Germany

<sup>21</sup>Emergency Department, University Hospital Regensburg, Regensburg, Germany

N. N. Kleineberg, S. Knauss and E. Gülke contributed equally, and are joint first authors. J. Erber, C. Franke and C. Warnke contributed equally, and are joint last authors.

This is an open access article under the terms of the Creative Commons Attribution-NonCommercial-NoDerivs License, which permits use and distribution in any medium, provided the original work is properly cited, the use is non-commercial and no modifications or adaptations are made. © 2021 The Authors. *European Journal of Neurology* published by John Wiley & Sons Ltd on behalf of European Academy of Neurology.

<sup>&</sup>lt;sup>3</sup>Department of Neurology with Experimental Neurology, Charité – Universitätsmedizin Berlin, Corporate Member of Freie Universität Berlin and Humboldt Universität zu Berlin, Berlin, Germany

<sup>&</sup>lt;sup>4</sup>DZHK (German Centre for Cardiovascular Research), Partner Site, Berlin, Germany

<sup>&</sup>lt;sup>5</sup>Department of Neurology, University Medical Center Hamburg-Eppendorf, Hamburg, Germany

<sup>&</sup>lt;sup>6</sup>Institute of Medical Biometry, Epidemiology University Medical Centre Hamburg-Eppendorf, Hamburg, Germany

<sup>&</sup>lt;sup>7</sup>Department I for Internal Medicine, Faculty of Medicine and University Hospital of Cologne, University of Cologne, Cologne, Germany

<sup>&</sup>lt;sup>9</sup>Department of Neurology, Technical University of Munich, School of Medicine, Klinikum Rechts der Isar, Munich, Germany

<sup>&</sup>lt;sup>10</sup>Department of Neurology, Katholisches Klinikum Bochum, Klinikum der Ruhr Universität, Bochum, Germany

<sup>&</sup>lt;sup>11</sup>Department of Neurology, Technical University of Munich, School of Medicine, Klinikum Rechts der Isar, Munich, Germany

<sup>&</sup>lt;sup>12</sup>Department of Neurology with Clinical Neurophysiology, Hannover Medical School, Hannover, Germany

<sup>&</sup>lt;sup>16</sup>German Center for Neurodegenerative Diseases (DZNE), Partner Site Berlin, Berlin, Germany

<sup>22</sup>Department of Infectious Diseases and Infection Control, University Hospital Regensburg, Regensburg, Germany

<sup>23</sup>Department of Internal Medicine II, Hematology and Medical Oncology, University Hospital Jena, Jena, Germany

<sup>24</sup>Leibniz Institute for Natural Product Research and Infection Biology, Hans-Knöll Institute, Jena, Germany

<sup>25</sup>Department of Internal Medicine, Klinikum Dortmund, Dortmund, Germany

<sup>26</sup>Department of Internal Medicine I, Passau Hospital, Passau, Germany

<sup>27</sup>Department of Internal Medicine I, Hospital Bremen Central, Bremen, Germany

<sup>28</sup>Department of Internal Medicine IV, University Hospital Heidelberg, Heidelberg, Germany

<sup>29</sup>Department of Infectious Diseases, West German Centre of Infectious Diseases, University Hospital Essen, University Duisburg-Essen, Essen, Germany
<sup>30</sup>Department of Pharmacy, Städtisches Klinikum, Karlsruhe, Germany

<sup>31</sup>Department of Gastroenterology, Hepatology and Infectious Diseases, University Hospital Düsseldorf, Düsseldorf, Germany

<sup>32</sup>Department of Internal Medicine, Infectious Diseases, University Hospital Frankfurt, Goethe University Frankfurt, Frankfurt am Main, Germany

<sup>33</sup>Department of Internal Medicine II, Technical University of Munich, School of Medicine, University Hospital Rechts der Isar, Munich, Germany

### Correspondence

Nina N. Kleineberg, Department of Neurology, University Hospital Cologne, Kerpener Str. 62, 50937 Cologne, Germany. Email: nina.kleineberg@uk-koeln.de

### Funding information

The German Neurological Society funded SK, NNK and EG for COVID-19 related research. No further or specific funding was received for this study.

### Abstract

**Background and purpose:** During acute coronavirus disease 2019 (COVID-19) infection, neurological signs, symptoms and complications occur. We aimed to assess their clinical relevance by evaluating real-world data from a multinational registry.

**Methods:** We analyzed COVID-19 patients from 127 centers, diagnosed between January 2020 and February 2021, and registered in the European multinational LEOSS (Lean European Open Survey on SARS-Infected Patients) registry. The effects of prior neurological diseases and the effect of neurological symptoms on outcome were studied using multivariate logistic regression.

**Results:** A total of 6537 COVID-19 patients (97.7% PCR-confirmed) were analyzed, of whom 92.1% were hospitalized and 14.7% died. Commonly, excessive tiredness (28.0%), headache (18.5%), nausea/emesis (16.6%), muscular weakness (17.0%), impaired sense of smell (9.0%) and taste (12.8%), and delirium (6.7%) were reported. In patients with a complicated or critical disease course (53%) the most frequent neurological complications were ischemic stroke (1.0%) and intracerebral bleeding (ICB; 2.2%). ICB peaked in the critical disease phase (5%) and was associated with the administration of anticoagulation and extracorporeal membrane oxygenation (ECMO). Excessive tiredness (odds ratio [OR] 1.42, 95% confidence interval [CI] 1.20–1.68) and prior neurodegenerative diseases (OR 1.32, 95% CI 1.07–1.63) were associated with an increased risk of an unfavorable outcome. Prior cerebrovascular and neuroimmunological diseases were not associated with an unfavorable short-term outcome of COVID-19.

**Conclusion:** Our data on mostly hospitalized COVID-19 patients show that excessive tiredness or prior neurodegenerative disease at first presentation increase the risk of an unfavorable short-term outcome. ICB in critical COVID-19 was associated with therapeutic interventions, such as anticoagulation and ECMO, and thus may be an indirect complication of a life-threatening systemic viral infection.

#### KEYWORDS

COVID-19, neurological manifestations, SARS-CoV-2

## INTRODUCTION

The coronavirus disease 2019 (COVID-19) pandemic, caused by severe acute respiratory syndrome coronavirus 2 (SARS-CoV-2), is challenging health systems worldwide and exerting a strain on patient-centered hospital care. In addition to fever and respiratory symptoms [1], involvement of the peripheral (PNS) and the central nervous system (CNS) has been observed [2]. Although evidence for direct viral infection of the CNS resulting in meningitis or encephalitis is weak [3,4], histopathological post mortem studies suggest that

**FIGURE 1** Definition of disease phases. GOT, glutamate-oxaloacetate transaminase; GPT, glutamate pyruvate transaminase; qSOFA, quick sepsis-related organ failure assessment score [Colour figure can be viewed at wileyonlinelibrary. com]

> Uncomplicated phase
>  Asymptomatic Or
>  Symptoms of upper respiratory tract infection, nausea,

> > emesis, diarrhea,

fever

# Complicated phase

- Need of oxygen supplementation
- PaO<sub>2</sub> at room air
   <70 mmHg</li>
- GOT or GPT >5x ULN
- new cardiac arrhythmia
- new pericardial
- effusion >1cm
  new heart failure with pulmonary edema, congestive hepatopathy or peripheral edema

## **Critical phase**

•

•

- Need of catecholamines
- Life-threatening cardiac arrhythmia
  - Mechanical ventilation (invasive, non-invasive)
- Liver failure with Quick <50%
  - qSOFA≧2 Renal failure in need
- Renal failure in need of dialysis

SARS-CoV-2 can invade the nervous system, despite there being no clear evidence for CNS damage directly caused by the virus [5].

The early neurological manifestations observed range from smell and taste dysfunction, dizziness, headache, myalgia, and impaired consciousness [2,6] to severe neurological complications, such as cerebrovascular events or encephalopathy [7–10].

These neurological symptoms are likely to be of relevance for short- and long-term patient outcomes. Severe complications may be associated with increased early mortality [11], while relatively mild symptoms may persist as part of a so-called "long-COVID" or "post-COVID-syndrome" in some patients. This may contribute to prolonged morbidity after recovery from the acute respiratory infection [10,12–15]. As such, prospective large-scale studies are warranted to clarify the relevance of neurological symptoms and complications of COVID-19. Studies on neurological manifestations related to disease outcome are complicated by the fact that several variables, e.g., older age, male sex, or cardiovascular morbidity, that are consistently associated with an increased risk of a more severe COVID-19 disease course [16,17], need to be considered as possible confounders. The same is true for neurological premorbidity that may affect the symptoms reported and COVID-19 outcome.

Furthermore, dementia or stroke were reported to be independently associated with COVID-19-related deaths in one study [18]. In contrast, others did not observe an increased risk of a more severe COVID-19 disease course in patients with Parkinson's disease or dementia [19] or multiple sclerosis [20,21].

Using data from the multinational, observational cohort of patients included in the Lean European Open Survey on SARS-Infected Patients (LEOSS) registry [16], we aimed to characterize the occurrence and frequencies of neurological symptoms and complications reported during the acute phase of a SARS-CoV-2 infection and to determine the impact of these symptoms and complications, and prior neurological diseases on COVID-19 disease outcome.

## METHODS

### Study design and patient cohort

In this observational study, we analyzed data on patients with confirmed SARS-CoV-2 infection included in LEOSS, with diagnosed infection between January 2020 and February 2021. Submission of patients' data into LEOSS was accessible for the approved 127 partner sites, i.e., physicians from hospitals, outpatient clinics and private practices across Europe involved in the treatment of COVID-19 patients. Data were recorded retrospectively and anonymously. A dedicated form for neurological data items was developed by a working group of specialized neurologists across Germany and implemented in the registry. From this set, the following signs and symptoms were analyzed: impaired sense of smell and taste; nausea and emesis; muscle ache and weakness; delirium; excessive tiredness; headache; and meningism. Additionally, intracerebral bleeding (ICB), ischemic stroke, meningitis and encephalitis, seizures, critical illness myopathy (CIM) and critical illness polyneuropathy (CIP) were recorded as neurological manifestations and complications.

In LEOSS, data assessments are retrieved in different disease phases, namely, at baseline (timepoint of positive SARS-CoV-2 test result), in the uncomplicated (UC) phase, in the complicated (CO) phase, and in the critical (CR) phase (for phase definitions, see Figure 1 and Jakob et al. [16]).

### Statistical analyses

Descriptive analyses were performed for the entire cohort and for each of the clinical phases documented (UC, CO and CR phases). If a sign or symptom was neither reported nor the option "unknown" ticked in LEOSS, this may suggest that the symptom was absent or the data entry was incomplete. To account for reporting bias, we analyzed the descriptive data in respect to valid data entries of each of the items collected, explaining the different denominators for several of the items analyzed. The durations of the in-patient stay in the hospital, on the intensive care unit (ICU), and of the mechanical ventilation were calculated as median with interquartile range (IQR) and mean  $\pm$  standard deviation (SD). The chi-squared test was used to associate anticoagulation, interventions, and laboratory results with the occurrence of ICB.

Two clinical endpoints were defined: (i) death during hospitalization (EP1) and (ii) a combined endpoint, death or a CR phase (defined as complicated or critical phase) or no recovery until last-known status (EP2). Relationships among potential explanatory variables for the outcome (age, sex, pre-existing diseases, such as asthma, pulmonary diseases, cardiovascular diseases, cerebrovascular diseases, neurodegenerative diseases, neuroimmunological diseases, and the signs and symptoms impaired sense of smell and taste, muscle aches and weakness, excessive tiredness, headache, delirium [Table 4]) and the two endpoints were examined using nonlinear, categorical principal component analysis (CATPCA) [22]. Their associations were evaluated primarily based on their loadings on the first two dimensions extracted by the analysis. Before CATPCA and logistic regression analyses were performed, missing data were replaced by multiple imputations, using the fully conditional specification method and producing five imputed datasets. All variables involved in CATPCA and logistic regression served as independent variables for imputation, but missing data for the two endpoints were not imputed. Age categories were treated as a continuous variable. Univariable logistic regression analyses tested the effects of individual independent variables on EP1 and EP2 (Table S2 and Figure S1). The univariable model was further adjusted for age and sex. All independent variables were entered in a multivariable logistic regression model (initial full model). Nonsignificant independent variables were then removed from the multivariable model following a stepwise-backward procedure. The level of significance was set at p < 0.05, two-sided. Statistical analyses were performed using SPSS version 27.

### Ethics statement and anonymization processing

The study was approved by the local ethics committees, waiving the requirement for written informed consents for routine clinical data recorded anonymously. Please see Jakob et al. [16] for further information regarding ethical statements and trial registration of LEOSS, and for the anonymization procedure see Jakob et al. [23].

### RESULTS

### Cohort description and outcome

We analyzed data from 6537 patients with SARS-CoV-2 infection, diagnosed between January 2020 and February 2021 (for monthly enrollment, see Table S1). Most patients were reported from German study sites (93.6%, 6295/6537), the diagnosis was PCR-confirmed in 97.7% (6197/6341) and 57.7% of the patients (3773/6537) were male. The majority of patients was between 46 and 85 years old (70.7%, 4622/6537) and 8.1% (528/6537) were older than 85 years. Most patients were hospitalized (92.1%, 5972/6484) with a mean in-patient stay of 14.1  $\pm$  14.4 days (median [IQR] 10 [13] days). Of all hospitalized patients, 37.0% (1467/3960) were treated in an ICU, with a mean duration of 15.8  $\pm$  16.3 days on ICU (median [IQR] 11 [18] days). Of the ICU patients, 81.1% (994/1226) required mechanical ventilation, on average for 16.8  $\pm$  15.7 days (median [IQR] 12 [17] days). A total of 47.2% of the patients (3087/6529) did not exceed the UC disease phase, one third reached the CO phase (33.5%, 2187/6529), and 19.4% the CR phase (1264/6529). The overall mortality rate was 14.7% (954/6503; Table 1).

Regarding prior neurological diseases, previous cerebrovascular disease was reported in 8.4% (531/6295), neurodegenerative diseases (dementia, movement disorders, motor neuron diseases) in 9.6% (603/6305), and neuroimmunological diseases (multiple sclerosis, neuromyelitis optica spectrum diseases, myasthenia gravis, and other autoimmune-mediated diseases) in 2.3% (146/6296; Table 1).

# Neurological signs and symptoms, manifestations and complications

Commonly, excessive tiredness (28.0%, 1466/5240), headache (18.5%, 942/5096), nausea and emesis (16.6%, 867/5227), muscular weakness (17.0%, 890/5242), impaired sense of smell (9.0%, 443/4964) and taste (12.8%, 636/4972) were reported, mostly in the UC and CO phase. Delirium occurred in all phases and overall in 6.7% of patients (340/5045), peaking in the CR phase (12.9%, 127/987; Table 2). Glasgow coma scale (GCS) score at baseline was reported for 43.4% of the patients (2839/6537). Of these, 55.9% (1586/2839) presented with GCS score of 15, while 39.1% (1109/2839) showed a slightly reduced level of consciousness with GCS score of 13 to 14 at baseline, and 2.1% (59/2839) presented with a GCS score of 8 or less.

Of the patients reaching the CO or CR disease phase (52.8%, 3451/6537), the most frequent and severe neurological complications were cerebrovascular events. ICB (2.2%, 57/2605) was more frequently observed than ischemic stroke (1.0%, 26/2578), peaking in the CR phase at 5.0% (51/1027; Table 2). Patients with ICB in the CR phase more frequently showed thrombocytopenia (p = 0.006) and an elevated activated partial thromboplastin time (aPPT; p = 0.033). In these patients, therapeutic anticoagulation, mostly heparin (leading to an elevated aPPT), as well as extracorporeal membrane oxygenation (ECMO) were associated with ICB (p < 0.01and p < 0.0001, respectively; Table 3).

Meningitis and encephalitis were reported in 0.6% (16/2578) of the patients with a complicated or critical disease course. Steroids were administered in 7.1% (351/4947) of the patients in the UC phase, in 25.4% (679/2678) in the CO phase and in 39.4% (438/1108) in the CR phase. There was no significant association between

### TABLE 1 Characteristics of the SARS-CoV-2 patient cohort

		Disease phase					
	Total	UC	со	CR			
	N = 6537 % (n)	N = 5487 % (n)	N = 2965 % (n)	N = 1264 % (n)			
Characteristics							
Age							
<14 years	0.9 (59)	1.0 (54)	0.4 (12)	0.5 (6)			
15–25 years	3.6 (233)	4.1 (225)	0.9 (27)	1.2 (15)			
26-45 years	16.8 (1095)	18.6 (1022)	8.8 (261)	7.0 (89)			
46-65 years	33.9 (2214)	34.4 (1887)	32.9 (975)	37.1 (469)			
66-85 years	36.8 (2408)	34.7 (1904)	46.1 (1368)	47.3 (598)			
>85 years	8.1 (528)	7.2 (395)	10.9 (322)	6.9 (87)			
Sex							
Female	42.3 (2764)	43.0 (2358)	39.0 (1157)	28.5 (360)			
Male	57.7 (3773)	57.0 (3129)	61.0 (1808)	71.5 (904)			
Prior neurological diseases							
Cerebrovascular diseases	8.4 (531/6295)						
Neurodegenerative diseases	9.6 (603/6305)						
Neuroimmunological diseases	2.3 (146/6296)	2.3 (146/6296)					
	% (n/N)	Mean $\pm$ SD, days		Median [IQR] days			
Hospitalization							
No in-patient stay	7.9 (512/6484)						
In-patient stay	92.1 (5972/6484)	$14.1 \pm 14.4$		10 [13]			
ICU stay of hospitalized patients							
No ICU stay	63.0 (2493/3960)						
ICU stay	37.0 (1467/3960)	$15.8 \pm 16.3$		11 [18]			
Ventilation of patients with ICU stay							
No ventilation	18.9 (232/1226)						
Ventilation	81.1 (994/1226)	$16.8 \pm 15.7$		12 [17]			
Disease course and outcome							
Disease course, most severe phase r	eached						
UC phase	47.1 (3087/6529)						
CO phase	33.5 (2187/6529)						
CR phase	19.4 (1264/6529)						
Last known status							
Recovered	74.9 (4869/6503)						
Not recovered	10.5 (680/6503)						
Death	14.7 (954/6503)						

*Note:* Distributions are listed for the entire cohort (total), and in respect to the disease phases, thus multiple entries of a patient in the UC, CO or CR phase are possible. Neurodegenerative diseases: movement disorders, motor neuron diseases, and dementia; neuroimmunological diseases: multiple sclerosis, neuromyelitis opticum spectrum diseases, myasthenia gravis, and other unspecified immune-mediated neurological diseases. Abbreviations: UC, uncomplicated phase; CO, complicated; CR, critical; ICU, intensive care unit; IQR, interquartile range; SD, standard deviation.

steroid administration, and the occurrence of meningitis/encephalitis, intracerebral hemorrhage or ischemic stroke.

## Neurological signs, symptoms, complications, and neurological premorbidity as explanatory variables of outcome

Epileptic seizures were observed in 20 patients (0.8%, 20/2577) with a CO or CR disease course, predominantly reported in the CR phase (1.2%, 12/1018). CIM and CIP occurred in 6.3% (55/874) and 7.6% of patients (66/873) during the CR phase (Table 2).

Categorical principal component analysis indicated close associations amongst cardiovascular diseases, cerebrovascular diseases,

Neurological N	All phases/total N = 6537 % (n/N)	BL N = 6537 % (n/N)	UC phase N = 5487 % (n/N)	CO phase N = 2965 % (n/N)	CR phase N = 1264 % (n/N)		
Nausea/ emesis 1	16.6 (867/5227)	10.1 (547/5400)	10.3 (544/5303)	9.1 (227/2498)	4.2 (40/958)		
Muscle aches 1	19.1 (976/5121)	10.2 (664/5334)	15.4 (720/4667)	9.9 (247/2491)	3.1 (29/944)		
Muscle 1 weakness	17.0 (890/5242)	11.7 (626/5336)	13.0 (603/4625)	13.5 (336/2488)	8.7 (83/958)		
Delirium 6	6.7 (340/5045)	2.0 (107/5345)	1.6 (76/4614)	5.4 (136/2513)	12.9 (127/987)		
Excessive 2 tiredness	28 (1466/5240)	17.4 (936/5390)	19.8 (931/4709)	23.1 (588/2542)	11.5 (110/956)		
Headache 1	18.5 (942/5096)	12.0 (642/5334)	14.5 (677/4668)	8.6 (214/2485)	3.0 (28/945)		
Meningism 1	1.3 (64/4958)	0.4 (22/5313)	0.2 (9/4591)	0.4 (11/2472)	0.3 (3/955)		
Smell sense 9 impaired	9.0 (443/4964)	5.6 (292/5251)	7.0 (319/4563)	3.7 (89/2414)	1.1 (10/933)		
Taste sense 1 impaired	12.8 (636/4972)	8.4 (445/5267) 9.7 (445/4569)		7.6 (185/2425)	1.7 (16/934)		
Glasgow Coma Scale	2						
15	15 55.						
13-14		39.1 (1109/2839)					
9-12		3.0 (85/2839)					
3-8	3-8		2.1 (59/2839)				
Neurological complications		Total (CO or CR pl N = 3451	Total (CO or CR phase) N = 3451		CR phase <i>N</i> = 1264		
Intracerebral bleeding 2.2 (57/260		2.2 (57/2605)		0.4 (9/2565)	5.0 (51/1027)		
Ischemic stroke 1.0 (26/2578)			0.5 (14/2562)	1.3 (13/1019)			
Meningitis/ encephalitis		0.6 (16/2578)		0.2 (5/2564)	1.3 (13/1019)		
Seizure		0.8 (20/2577)		0.3 (8/2564)	1.2 (12/1018)		
CIM	2.6 (55/2146)			0.0 (0/2114)	6.3 (55/874)		
CIP		3.2 (68/2150)		0.1 (3/2113)	7.6 (66/873)		

Note: The here listed percentages are in respect to the valid data entries (as listed in brackets for each item, missing values per item excluded). Neurological symptoms "all phases" depicts the occurrence of a symptom in the entire cohort. The neurological complications in total (CO or CR phase) represent the sum score of the patients that underwent the CO or CR phase.

Further, a symptom in the respected disease phase (BL, or UC, CO or CR phase) or a neurological complication (CO, CR phase) is reported. In the presentation by phase, multiple entries of a patient in UC, CO, or CR phase are possible, when a patient underwent various disease phases in the longitudinal course.

Abbreviations: BL, baseline; CO, complicated phase; CR, critical; CIM, critical illness myopathy; CIP, critical illness polyneuropathy; UC, uncomplicated phase.

pulmonary as well as neurodegenerative diseases, age, and the two endpoints "death" and "death / CR phase / no recovery" (Figure 2, cf. Table 4 for variable definition). Asthma, neuroimmunological diseases, and other baseline symptoms (headache, muscle aches and weakness, impaired sense of smell and taste, excessive tiredness and delirium) were not closely related.

In the multivariable final model, the strongest predictor of death (EP1) was older age (odds ratio (OR) 2.78; 95% confidence interval [CI] 2.48–3.12), followed by chronic pulmonary disease (OR 1.98, 95% CI 1.62–2.43), male sex (OR 1.84, 95% CI 1.57–2.16), neuro-degenerative diseases (OR 1.56, 95% CI 1.27–1.93) and cardiovas-cular (OR 1.54, 95% CI 1.28–1.87) diseases. The baseline symptom

headache was associated with a lower risk of death (OR 0.60, 95% CI 0.41-0.89; Table 5).

The strongest predictors of EP2 (death or a CR phase or no recovery until last-known status) were cardiovascular diseases (OR 1.71, 95% CI 1.51–1.93), pulmonary diseases (OR 1.72, 95% CI 1.41– 2.11), older age (OR 1.54, 95% CI 1.44–1.64), the baseline symptom excessive tiredness (OR 1.42, 95% CI 1.20–1.68), male sex (OR 1.37, 95% CI 1.23–1.53) and asthma (OR 1.37, 95% CI 1.08–1.75), respectively. The baseline symptom headache (OR 0.76, 95% CI 0.63–0.93) and pre-existing neuroimmunological diseases (OR 0.64, 95% CI 0.44–0.92) were associated with a lower risk for the combined endpoint (Table 5 and Figure S1). TABLE 3 Laboratory results and anticoagulation/interventions in relation to intracerebral bleeding

Laboratory results	Total (CR phase) % (n/N)	No ICB (CR phase) % (n/N)	ICB (CR phase) % (n/N)	p-value	
Platelet count					
<10,000/µl	1.7 (16/941)	1.6 (14/892)	4.1 (2/49)	0.006	
10,000-49,999/µl	6.5 (61/941)	6.2 (55/892)	12.2 (6/49)		
50,000-119,999/µl	14.7 (164/941)	16.5 (147/892)	34.7 (17/49)		
120,000-449,999/µl	57.9 (545/941)	59.1 (527/892)	36.7 (18/49)		
450,000-799,000/μl	15.5 (146/941)	15.7 (140/ 892)	12.2 (6/49)		
800,000-1,199,999/µl	0.7 (7/941)	0.8 (7/892)	0.0 (0/49)		
>1,199,9999/µl	0.2 (2/941)	0.2 (2/892)	0.0 (0/49)		
aPTT					
>25 s	5.6 (44/780)	5.7 (42/738)	4.8 (2/42)	0.033	
25-39 s	31.5 (246/780)	32.5 (240/738)	14.3 (6/42)		
40-54 s	16.2 (126/780)	16.4 (121/738)	11.9 (5/42)		
55-69 s	10.5 (82/780)	9.9 (73/738)	21.4 (9/42)		
70-84 s	10.0 /78/780)	9.6 (71/738)	16.7 (7/42)		
>84 s	26.2 (204/780)	25.9 (191/738)	31.0 (13/42)		
INR					
<1.25	45.7 (364/797)	46.6 (351/754)	30.2 (12/43)	0.199	
1.25-2	41.0 (327/797)	40.3 (304/754)	53.5 (23/43)		
2-3.5	8.4 (67/797)	8.2 (62/754)	11.6 (5/43)		
>3.5	4.9 (39/797)	4.9 (37/754)	4.7 (2/43)		
Anticoagulation/ Intervention					
Prophylactic heparin <sup>a</sup>	48.3 (475/983)	48.7 (455/934)	40.8 (20/49)	0.281	
Subtherapeutic heparin <sup>b</sup>	7.9 (67/848)	7.9 (64/806)	7.1 (3/42)	0.852	
Therapeutic Anticoagulation <sup>c</sup>	43.1 (420/975)	42.1 (389/924)	60.8 (31/51)*	0.009	
Antiplatelet agents <sup>d</sup>	23.3 (198/848)	23.1 (186/806)	28.6 (12/42)	0.412	
ECMO administration	17.0 (149/878)	14.7 (123/829)	53.1 (26/49)	<0.0001	

Statistics were calculated as cross tables and p-values assessed by chi-squared tests. p < 0.05 was considered statistically significant.

Abbreviations: CR, critical; ICB, intracerebral bleeding; aPTT, activated partial thromboplastin time; INR, international normalized ratio; ECMO, extracorporeal membrane oxygenation.

<sup>a</sup>Heparin or low-molecular weight heparin in prophylactic dose.

<sup>b</sup>Heparin or low-molecular weight heparin in subtherapeutic dose, i.e., more than prophylactic, but less than therapeutic dose.

<sup>c</sup>Therapeutic anticoagulation, either heparin or low-molecular weight heparin, or argatroban or direct oral anticoagulation in therapeutic dose, \*hereof: 23 patients treated with heparin in therapeutic doses.

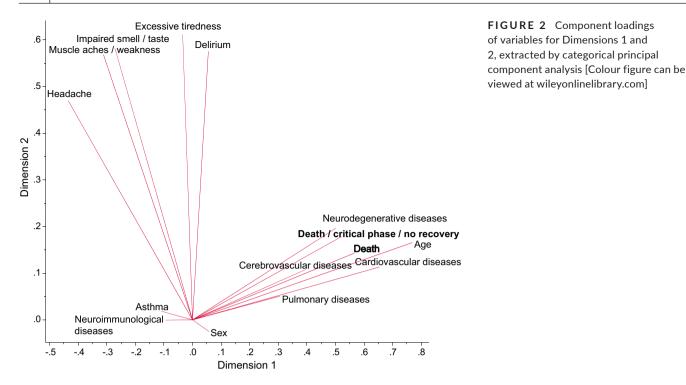
<sup>d</sup>Antiplatelet agents: either aspirin, Adenosine-diphosphate (ADP) -receptor antagonists or glycoprotein-inhibitor IIa/IIIb.

## DISCUSSION

The present large-scale analysis from LEOSS, a European multinational registry-based cohort study, focused on neurological signs, symptoms and complications in predominantly hospitalized (92.1%) SARS-CoV-2-infected patients who were mostly enrolled from German study sites (92.6%).

Olfactory and gustatory dysfunction, which can also occur in the absence of respiratory symptoms and nasal congestion, is considered a rather specific feature of COVID-19 patients, and may suggest direct involvement of the nervous system [24]. The rate of impaired sense of smell (9.0%) and taste (12.8%) in our cohort fell into the lower range compared to other studies reporting a prevalence between 5% and 88% [6,24,25]. The fact that the LEOSS cohort consists of predominantly hospitalized patients (>90%) with a comparably severe disease course, and the recruitment of patients was mainly by physicians not specialized in neurology, may explain this finding, leading to underreporting of this rather mild, albeit specific symptom [16]. Olfactory and gustatory dysfunction had no impact on the early disease course. However, as these symptoms were consistently shown in previous studies to persist in a relevant proportion of patients far beyond recovery from the acute respiratory infection [12–14], these symptoms may still cause prolonged morbidity and neurological sequelae in a subset of patients.

Most of the other neurological signs and symptoms reported at baseline in our study were non-specific, with a high prevalence of excessive



Variable	Definition
EP1	Death
EP2	Death or CR phase or no recovery until last-known status
Age	Ranging from <14 to >85 years in six categories: (i) <14 years (reference category); (ii) 15– 25 years, (iii) 26–45 years, (iv) 46–65 years; (v) 66–85 years 6) >85 years
Sex	Male; Female
Asthma	Baseline comorbidity asthma
Pulmonary diseases	Baseline comorbidity chronic obstructive pulmonary disease (COPD) or other chronic pulmonary disease
Cardiovascular diseases	Baseline comorbidity myocardial infarction or coronary artery disease or hypertension or diabetes mellitus
Cerebrovascular diseases	Baseline comorbidity cerebrovascular disease
Neurodegenerative diseases	Baseline comorbidity movement disorder or dementia or motor neuron disease
Neuroimmunological diseases	Baseline comorbidity multiple sclerosis or myasthenia gravis or neuromyelitis optica spectrum disorder or other immune-mediated neurological disease
Delirium	Baseline symptom delirium
Headache	Baseline symptom headache
Excessive tiredness	Baseline symptom excessive tiredness
Smell and taste impaired	Baseline symptom impaired sense of smell or taste
Muscle aches and weakness	Baseline symptom muscle aches or muscle weakness

tiredness, headache, muscular weakness, and nausea/emesis, which was within the range of previously published articles studying COVID-19 patients [1,6,26-28]. We observed a relatively high prevalence of nausea and emesis (10%) at baseline and the UC phase. Considering this high frequency reported during the UC phase, we regard this as a non-specific sign of COVID-19, and not an indication of direct involvement of the nervous system as previously hypothesized [28].

The prevalence of neurological complications in the present study was mostly in line with previous studies, which reported overall neurological complications in 3.5%–13.5% of hospitalized patients [11,29]. The most common acute neurological events found in the present study were strokes. In patients with a CO or CR disease course, we noted ischemic stroke in 1.0% (26/2578), and hemorrhagic stroke in 2.2% (57/2605), a prevalence overall comparable

### TABLE 5 Multivariable logistic regression models

		Multivariable, full model			Multivariable, final model, adjusted for age and sex				
Outcome	Independent variable	OR	95% Cl Iower limit	95% Cl upper limit	p-value	OR	95% CI Iower limit	95% Cl upper limit	p-value
Death	Older age	2.731	2.431	3.069	0.000	2.781	2.478	3.121	0.000
	Male sex	1.820	1.551	2.136	0.000	1.841	1.569	2.159	0.000
	Pulmonary d.	1.974	1.609	2.423	0.000	1.982	1.619	2.427	0.000
	Asthma	0.666	0.429	1.034	0.070				
	Cardiovascular d.	1.534	1.268	1.856	0.000	1.544	1.279	1.865	0.000
	Cerebrovascular d.	1.052	0.836	1.326	0.664				
	Neurodegenerative d.	1.486	1.197	1.846	0.000	1.564	1.267	1.930	0.000
	Neuroimmunological d.	0.657	0.337	1.282	0.218				
	Excessive tiredness	0.944	0.723	1.233	0.662				
	Headache	0.671	0.452	0.994	0.047	0.602	0.408	0.887	0.011
	Muscle aches/weakness	0.927	0.661	1.299	0.637				
	Impaired smell / taste	0.514	0.276	0.959	0.037				
	Delirium	1.716	0.914	3.223	0.088				
Death or	Older age	1.532	1.434	1.637	0.000	1.535	1.437	1.640	0.000
complicated phase or no	Male sex	1.373	1.233	1.528	0.000	1.374	1.234	1.529	0.000
recovery	Pulmonary d.	1.716	1.402	2.101	0.000	1.724	1.409	2.110	0.000
	Asthma	1.381	1.081	1.764	0.010	1.372	1.076	1.749	0.011
	Cardiovascular d.	1.713	1.515	1.937	0.000	1.711	1.514	1.933	0.000
	Cerebrovascular d.	1.000	0.810	1.235	0.998				
	Neurodegenerative d.	1.274	1.027	1.581	0.028	1.320	1.067	1.632	0.010
	Neuroimmunological d.	0.655	0.455	0.941	0.022	0.639	0.443	0.920	0.016
	Excessive tiredness	1.398	1.176	1.661	0.000	1.421	1.204	1.676	0.000
	Headache	0.772	0.626	0.952	0.017	0.764	0.625	0.934	0.010
	Muscle aches/weakness	1.043	0.861	1.263	0.655				
	Impaired smell/taste	0.765	0.575	1.018	0.066				
	Delirium	1.654	0.938	2.915	0.079				

Pooled results from analyses on five imputed data sets. In the final multivariable model, only significant predictors (p < 0.05) were included. Abbreviations: CI, confidence interval, d., diseases; OR, odds ratio.

to previously reported studies reporting strokes (range 1.1%–1.9%) [11,29,30]. In the present study, the occurrence of ischemic stroke increased with disease severity (CO phase: 0.5%; CR phase: 1.3%), possibly explained by the association of COVID-19 with coagulop-athy [31].

Interestingly, while in most previous studies ischemic strokes were more frequent than hemorrhagic strokes [6,32–35], we found the opposite, with cerebral hemorrhages peaking in the CR phase (5.0%). This is probably explained by a higher frequency of interference with the blood coagulation system (Table 3), in particular, in the 53.1% of patients (26/49) with ICB treated with ECMO [36].

In the 16 patients with meningitis or encephalitis, cerebrospinal fluid findings were reported incompletely, not allowing further conclusions. To date, detection of SARS-CoV-2 RNA was only reported

in a few patients in the literature [37-41], suggesting that direct replicative infection of the CNS is rare.

Regarding the impact of neurological manifestations on COVID-19 disease outcome, we noted that excessive tiredness at baseline was associated with an increased risk for a more severe COVID-19 disease course. As this item was not further specified in LEOSS, the term may include motor and cognitive fatigue secondary to the severe infection, respiratory failure, or an involvement of the CNS.

Among the baseline signs and symptoms, headache was the only predictor of a lower risk of mortality and the combined endpoint considering the transition to a CO or CR phase or death. A possible explanation may be that individuals with a new onset of headache may seek early medical attention, possibly resulting in an earlier diagnosis of COVID-19 and optimized therapy. Further, patients who

KLEINEBERG ET AL.

are able to complain of headache at baseline, may be in a less severe medical condition, while patients at more severe disease stages may be unable to express this complaint. In line with these considerations and our findings, in a smaller cohort study of COVID-19 patients, there was a trend of headache being more frequently reported in the group without Acute Respiratory Distress Syndrome (ARDS) than with ARDS [42].

Extending previous work, the present study shows that a preexisting neurodegenerative disease (comprising dementia, movement disorders, and motor neuron diseases) is an independent risk factor for mortality and a more severe COVID-19 disease course. This finding persisted after adjusting for sex and age, and was consistently seen across the different age strata of the study. Indeed, patients with prior neurodegenerative diseases are at higher risk of reduced lung function and respiratory system-related complications, e.g., aspiration pneumonia due to dysphagia [43]. Further, patients who are experiencing advanced stages of dementia, movement disorders, or motor neuron disease may opt not to receive all the possible options of intensive care medicine, such as mechanical ventilation or ECMO, considering the invasive nature of such procedures and the anticipated limited expectations of success. Therefore, a higher mortality rate and worse outcomes in patients with neurodegenerative diseases appear plausible and fit with the literature. One study reported a higher case fatality rate for patients with Parkinson's disease [44]. Another study in a cohort of 16,749 patients hospitalized with COVID-19 reported that the combined prior conditions "dementia or stroke" were independently associated with COVID-19-related deaths [18]. Our study seems to contrast with a previous study [19] that found no association of outcome in patients affected by Parkinson's disease or dementia compared to matched controls without neurodegenerative diseases. This earlier study, also from the LEOSS registry, differs with regard to the overall population studied (4310 patients vs. 6537 in the present study), and the statistical methods used: Parkinson's disease or dementia were studied separately in a case-control-matching design, while we used a multivariable logistic regression approach and grouped the neurodegenerative diseases-dementia, movement disorders, and motor neuron diseases-to increase the power. While in the previous study a systematic sampling strategy was applied, randomly extracting 15 controls from the study population for each of the 40 patients with Parkinson's disease (1:15) and randomly selecting two controls for each of the 290 dementia patients (1:2), we adjusted for age and sex in our final multivariable model. Our approach, looking at a larger population of patients with neurodegenerative disease (total n = 603) and a different statistical approach likely explains the different findings, although we were unable to prove causality in the present study.

Concerns have been expressed that patients with immunemediated diseases treated with immunosuppressive drugs, such as patients with neuroimmunological diseases, might be at higher risk of a more severe COVID-19 disease course. A review of 873 SARS-CoV-2-infected patients with multiple sclerosis suggested no increased mortality and even possible beneficial effects of disease-modifying treatment [20,21]. In contrast, recent data from the Swedish multiple sclerosis registry suggests that B-cell-depleting therapy with rituximab may increase the risk of hospitalization (see Footnote<sup>1</sup>).

Our findings of an inverse association of neuroimmunological diseases with the combined endpoint "death or severe disease course" after adjusting for age and sex might partially be explained by a selection bias. A relatively high proportion of patients with neuroimmunological diseases was recruited from outpatient clinics, fitting the lower hospitalization rate (58.3%) compared to the entire cohort (92.1%). This observation is in line with recent literature [45,46], further demonstrating that higher Expanded Disability Status Scale (EDSS), progressive disease course, male sex, older age and comorbidities (e.g. obesity) are risk factors for a severe COVID-19 course in patients with multiple sclerosis [45,47].

The present study has obvious limitations, inherent to the study design. We analyzed anonymized registry data precluding, for instance, the analysis of imaging source, or individual cerebrospinal fluid data. The analysis had to rely on data obtained in predefined reporting forms, including items not further specified such as nausea/emesis or excessive tiredness. These signs and symptoms can possibly be explained by various, often non-neurological causes, in particular, when mainly entered by non-neurologists. Further, some neurological conditions like critical illness encephalopathy or sepsisassociated encephalopathy, as well as sinus thromboses, were not included in the LEOSS report forms. Additionally, missing values and incongruent answers may further limit data guality, and, due to a lack of follow-up data and inclusion of patients early after the confirmed infection with SARS-CoV-2, post-infectious neurological complications such as Guillain-Barré syndrome or long- or post-COVID-19 syndrome could not be assessed as part of this study. Concerning the generalizability of the data reported here, it is crucial to consider that 92.1% of the patients were hospitalized. As a result, asymptomatic SARS-CoV-2 infections and patients with only mild symptoms are underrepresented, while certain patient populations with specific comorbidities, in particular, patients with neuroimmunological or cerebrovascular diseases, or those treated with ECMO, might be overrepresented, resulting in a reporting bias.

The strength of this registry and the present study is the large-scale real-world patient data from a high number of patients with a PCR-confirmed SARS-CoV-2 infection (97.7%), representing a multicentric and multinational, European cohort, with unified and predefined data entry, accessible for registration of patients via personal accounts by treating medical doctors. This approach enabled the analysis of neuro-logical aspects of COVID-19 in more than 6500 individuals.

In conclusion, non-specific frequent neurological signs and symptoms at baseline, such as headache, muscular weakness, impaired sense of smell and taste, and delirium are not associated with an unfavorable outcome early during the COVID-19 disease course. Rates of severe acute neurological complications overall were compatible with previous reports, although a comparably high rate of ICB was noted in our cohort of patients with a critical disease course. This was likely related to a high rate of ECMO and anticoagulation therapy. This indicates that at least a fraction of the complications observed during critical COVID-19 are not due to direct viral effects, but occur secondarily during the attempt to save the life of a critically ill ICU patient, using invasive management strategies such as ECMO. Prior cerebrovascular and neuroimmunological diseases are not associated with an unfavorable short-term outcome of COVID-19, whereas patients with prior neurodegenerative diseases and those presenting with excessive tiredness appear to be at higher risk. Further investigations are needed to assess delayed-onset, prolonged, or persisting neurological symptoms and sequelae following the SARS-CoV-2 infection.

## ACKNOWLEDGMENTS

Nina N.Kleineberg, Samuel Knauss and Eileen Gülke thank the German Neurological Society (DGN) for their support funding the analyses for this study. Samuel Knauss is a participant in the BIH-Charité Digital Clinician Scientist Program funded by the Charité Universitätsmedizin Berlin and the Berlin Institute of Health. We express our deep gratitude to all study teams supporting the LEOSS study. The LEOSS study group contributed at least 5 per mille of the patients to the analyses of this study: Technical University of Munich (Christoph Spinner), University Hospital Regensburg (Frank Hanses), Hospital Passau (Julia Lanzster), Hospital Ingolstadt (Stefan Borgmann), University Hospital Düsseldorf (Björn Jensen), University Hospital Frankfurt (Maria Vehreschild), Hospital Dortmund (Martin Hower), University Hospital Jena (Maria Madeleine Rüthrich), University Hospital Freiburg (Siegbert Rieg), Robert-Bosch-Hospital Stuttgart (Katja Rothfuss), Hospital Bremen-Center (Christiane Piepel), Practice at Ebertplatz (Christopf Wyen), University Hospital Augsburg (Christoph Römmele), Hospital Leverkusen (Lukas Eberwein), St. Josef-Hospital – Catholic Hospital Bochum (Kerstin Hellwig), University Hospital Schleswig-Holstein - Lübeck (Kadja Käding), Johannes Wesling Hospital Minden (Kai Wille), Municipal Hospital Karlsruhe (Christian Degenhardt), Maria Hilf Hospital (Hendrik Haake), St. Josef Hospital Kupferdreh (Ingo Voigt), Hospital Ernst von Bergmann (Lukas Tometten), Evangelisches Stadtkrankenhaus Saarbrücken (Mark Neufang), University Hospital Cologne (Norma Jung) University Hospital Essen (Sebastian Dolff), University Hospital Heidelberg (Uta Merle), Marien Hospital Herne, University Hospital Bochum (Beate Schultheis), Tropical Clinic Paul-Lechler Hospital Tübingen (Claudia Raichle), University Hospital Munich/ LMU (Michael von Bergwelt-Baildon), University Hospital Tübingen (Siri Göpel), University Hospital Erlangen (Richard Strauß), Bundeswehr Hospital Koblenz (Dominic Rauschning), University Hospital Würzburg (Nora Isberner), Hospital St. Joseph-Stift Dresden (Lorenz Walter), Maltese Hospital St. Franziskus-Hospital Flensburg (Mile Milovanovic), MS Center Belgium (Marie D'Hooghe), Center for Infectiology Berlin/Prenzlauer Berg (Stephan Grunwald), Hacettepe University (Murat Akova), Hospital Fulda (Philipp Markart), University Hospital Ulm (Beate Grüner), Braunschweig Hospital (Jan Kielstein), Clinic Munich (Wolfgang Guggemos), Justus-Liebig-University Giessen (Janina Trauth), Agaplesion Diaconia Hospial Rotenburg (David Heigener), Medical School Hannover (Gernot Beutel), Pauls Stradins Clinical, University Hospital (Alise Gramatniece), University Hospital Dresden (Katja de With), University Hospital

Saarland (Robert Bals), University Hospital Schleswig-Holstein - Kiel (Anette Friedrichs), Hospital of the Augustinian Cologne (Stefani Röseler), Practice for general medicine Drs. Elisabeth Schrödter & Gabriele Müller-Jörger (Gabriele Müller-Jörger), Hospital Osnabrück (Annika Ritter). The LEOSS study infrastructure group: Jörg Janne Vehreschild (Goethe University Frankfurt), Lisa Pilgram (Goethe University Frankfurt), Carolin E. M. Jakob (University Hospital of Cologne), Melanie Stecher (University Hospital of Cologne), Max Schons (University Hospital of Cologne), Susana Nunes de Miranda (University Hospital of Cologne), Nick Schulze (University Hospital of Cologne), Sandra Fuhrmann (University Hospital of Cologne), Annika Claßen (University Hospital of Cologne), Bernd Franke (University Hospital of Cologne), Fabian Praßer (Charité, Universitätsmedizin Berlin) and Martin Lablans (University Medical Center Mannheim). Open Access funding enabled and organized by Projekt DEAL. WOA Institution: Uniklinik Koln Blended DEAL: Projekt DEAL.

### CONFLICT OF INTERESTS

All authors report no disclosures relevant to the manuscript.

### AUTHOR CONTRIBUTIONS

Nina N. Kleineberg: Conceptualization (lead); Formal analysis (lead); Methodology (lead); Project administration (lead); Software (lead); Visualization (equal); Writing - original draft (equal). Samuel Knauss: Conceptualization (lead); Methodology (lead); Project administration (lead); Software (supporting); Visualization (equal); Writing - original draft (equal). Eileen Gülke: Conceptualization (lead); Methodology (lead); Project administration (lead); Software (supporting); Visualization (equal); Writing -original draft (equal). Hans O. Pinnschmidt: Formal analysis (lead): Software (lead): Visualization (equal). Carolin E. M. Jakob: Data curation (lead); Project administration (equal). Paul Lingor: Writing - review and editing (supporting). Kerstin Hellwig: Writing - review and editing (supporting). Achim Berthele: Writing - review and editing (supporting). Günter Höglinger: Writing-original draft (supporting). Gereon R. Fink: Writing - review and editing (supporting). Mathias Endres: Writing review and editing (supporting). Christian Gerloff: Writing - review and editing (supporting). Christine Klein: Writing - review and editing (supporting). Melanie Stecher: Data curation (equal); Project administration (supporting). Annika Y. Classen: Data curation (equal); Project administration (supporting). Siegbert Rieg: Investigation (equal). Stefan Borgmann: Investigation (equal). Frank Hanses: Investigation (equal). Maria M. Rüthrich: Investigation (equal). Martin Hower: Investigation (equal). Lukas Tometten: Investigation (equal). Martina Haselberger: Investigation (equal). Christiane Piepel: Investigation (equal). Uta Merle: Investigation (equal). Sebastian Dolff: Investigation (equal). Christian Degenhardt: Investigation (equal). Björn-Erik O. Jensen: Investigation (equal). Maria J. G. T. Vehreschild: Investigation (equal). Johanna Erber: Investigation (lead); Writing - review and editing (equal). Christiana Franke: Conceptualization (lead); Formal analysis (supporting); Methodology (equal); Project administration (lead); Supervision (lead); Writing review and editing (lead). Clemens Warnke: Conceptualization (lead);

### DATA AVAILABILITY STATEMENT

The data are not publicly available due to privacy or ethical restrictions.

### ORCID

Nina N. Kleineberg b https://orcid.org/0000-0003-2582-878X Christiana Franke b https://orcid.org/0000-0002-5609-2472 Clemens Warnke b https://orcid.org/0000-0002-3510-9255

## ENDNOTE

<sup>1</sup> Pre-print, not yet peer reviewed: Spelman, Tim and Forsberg, Lars and McKay, Kyla and Glaser, Anna and Hillert, Jan, Increased Rate of Hospitalisation for COVID-19 Amongst Rituximab Treated Multiple Sclerosis Patients: A Study of the Swedish MS Registry. Available at SSRN: https://ssrn.com/abstract=3801769 or http://dx.doi. org/10.2139/ssrn.3801769

### REFERENCES

- 1. Guan W-J, Ni Z-Y, Hu YU, et al. Clinical characteristics of coronavirus disease 2019 in China. N Engl J Med. 2020;382(18):1708-1720.
- Chen X, Laurent S, Onur OA, et al. A systematic review of neurological symptoms and complications of COVID-19. J Neurol. 2021;268(2):392-402.
- Kremer S, Lersy F, Anheim M, et al. Neurologic and neuroimaging findings in patients with COVID-19: A retrospective multicenter study. *Neurology*. 2020;95(13):e1868-e1882.
- Katal S, Balakrishnan S, Gholamrezanezhad A. Neuroimaging and neurologic findings in COVID-19 and other coronavirus infections: a systematic review in 116 patients. *J Neuroradiol.* 2021;48(1):43-50.
- Matschke J, Lütgehetmann M, Hagel C, et al. Neuropathology of patients with COVID-19 in Germany: a post-mortem case series. *Lancet Neurol.* 2020;19(11):919-929.
- Mao L, Jin H, Wang M, et al. Neurologic manifestations of hospitalized patients with coronavirus disease 2019 in Wuhan, China. JAMA Neurol. 2020;77(6):683.
- Siegler JE, Cardona P, Arenillas JF, et al. Cerebrovascular events and outcomes in hospitalized patients with COVID-19: the SVIN COVID-19 Multinational Registry. Int J Stroke. 2021;16(4):437-447.
- Berlit P, Bösel J, Gahn G, et al. "Neurological manifestations of COVID-19" - guideline of the German society of neurology. *Neurol Res Pract*. 2020;2:51.
- 9. von Oertzen TJ, Macerollo A, Leone MA, et al. EAN consensus statement for management of patients with neurological diseases during the COVID-19 pandemic. *Eur J Neurol*. 2021;28(1):7-14.
- Schweitzer F, Kleineberg NN, Göreci Y, Onur OA, Franke C, Warnke C. Neuro-COVID-19 is more than anosmia: clinical presentation, neurodiagnostics, therapies, and prognosis. *Curr Opin Neurol.* 2021;34(3):423-431.
- 11. Frontera JA, Sabadia S, Lalchan R, et al. A prospective study of neurologic disorders in hospitalized COVID-19 patients in New York City. *Neurology*. 2021;96(4):e575-e586.
- 12. Arnold DT, Hamilton FW, Milne A, et al. Patient outcomes after hospitalisation with COVID-19 and implications for follow-up: results from a prospective UK cohort. *Thorax*. 2020;76(4):399-401.
- 13. Carfi A, Bernabei R, Landi F. Persistent symptoms in patients after acute COVID-19. JAMA. 2020;324(6):603-605.

- Chopra V, Flanders SA, O'Malley M, Malani AN, Prescott HC. Sixtyday outcomes among patients hospitalized with COVID-19. Ann Intern Med. 2021;174(4):576-578.
- Huang C, Huang L, Wang Y, et al. 6-month consequences of COVID-19 in patients discharged from hospital: a cohort study. *Lancet*. 2021;397(10270):220-232.
- Jakob CEM, Borgmann S, Duygu F, et al. First results of the "Lean European Open Survey on SARS-CoV-2-Infected Patients (LEOSS)". Infection. 2021;49(1):63-73.
- 17. Rahman A, Sathi NJ. Risk factors of the severity of COVID-19: a meta-analysis. *Int J Clin Pract*. 2020;75(7):e13916.
- Williamson EJ, Walker AJ, Bhaskaran K, et al. Factors associated with COVID-19-related death using OpenSAFELY. *Nature*. 2020;584(7821):430-436.
- Huber MK, Raichle C, Lingor P, et al. Outcomes of SARS-CoV-2 infections in patients with neurodegenerative diseases in the LEOSS Cohort. *Mov Disord*. 2021;36(4):791-793.
- Möhn N, Konen FF, Pul R, et al. Experience in multiple sclerosis patients with COVID-19 and disease-modifying therapies. a review of 873 published cases. J Clin Med. 2020;9(12):4067.
- Zabalza A, Cárdenas-Robledo S, Tagliani P, et al. COVID-19 in multiple sclerosis patients: susceptibility, severity risk factors and serological response. *Eur J Neurol.* 2021;28:3384-3395. https://doi. org/10.1111/ene.14690.
- 22. Linting M, van der Kooij A. Nonlinear principal components analysis with CATPCA: a tutorial. *J Pers Assess*. 2012;94(1):12-25.
- 23. Jakob CEM, Kohlmayer F, Meurers T, Vehreschild JJ, Prasser F. Design and evaluation of a data anonymization pipeline to promote Open Science on COVID-19. *Scientific data*. 2020;7(1):435.
- 24. Lechien JR, Chiesa-Estomba CM, De Siati DR, et al. Olfactory and gustatory dysfunctions as a clinical presentation of mild-to-moderate forms of the coronavirus disease (COVID-19): a multicenter European study. *Eur Arch Oto-Rhino-Laryngol.* 2020;277(8):2251-2261.
- Spinato G, Fabbris C, Polesel J, et al. Alterations in smell or taste in mildly symptomatic outpatients with SARS-CoV-2 infection. JAMA. 2020;323(20):2089-2090.
- Zhou F, Yu T, Du R, et al. Clinical course and risk factors for mortality of adult inpatients with COVID-19 in Wuhan, China: a retrospective cohort study. *Lancet*. 2020;395(10229):1054-1062.
- Wang D, Hu BO, Hu C, et al. Clinical characteristics of 138 hospitalized patients with 2019 novel coronavirus-infected pneumonia in Wuhan, China. JAMA. 2020;323(11):1061-1069.
- Andrews PLR, Cai W, Rudd JA, Sanger GJ. COVID-19, nausea, and vomiting. J Gastroenterol Hepatol. 2021;36(3):646-656.
- Xiong W, Mu J, Guo J, et al. New onset neurologic events in people with COVID-19 in 3 regions in China. *Neurology*. 2020;95(11):e1479 -e1487.
- Romero-Sánchez CM, Díaz-Maroto I, Fernández-Díaz E, et al. Neurologic manifestations in hospitalized patients with COVID-19: The ALBACOVID registry. *Neurology*. 2020;95(8):e1060-e1070.
- Iba T, Levy JH, Connors JM, Warkentin TE, Thachil J, Levi M. The unique characteristics of COVID-19 coagulopathy. *Crit Care*. 2020;24(1):360.
- Li Y, Li M, Wang M, et al. Acute cerebrovascular disease following COVID-19: a single center, retrospective, observational study. *Stroke Vasc Neurol.* 2020;5(3):279-284.
- Jain R, Young M, Dogra S, et al. COVID-19 related neuroimaging findings: a signal of thromboembolic complications and a strong prognostic marker of poor patient outcome. J Neurol Sci. 2020;414:116923.
- Rothstein A, Oldridge O, Schwennesen H, Do D, Cucchiara BL. Acute cerebrovascular events in hospitalized COVID-19 patients. *Stroke*. 2020;51(9):e219-e222.
- 35. Klok FA, Kruip M, van der Meer NJM, et al. Incidence of thrombotic complications in critically ill ICU patients with COVID-19. *Thromb Res.* 2020;191:145-147.

- Zahid MJ, Baig A, Galvez-Jimenez N, Martinez N. Hemorrhagic stroke in setting of severe COVID-19 infection requiring Extracorporeal Membrane Oxygenation (ECMO). J Stroke Cerebrovasc Dis. 2020;29(9):105016.
- Moriguchi T, Harii N, Goto J, et al. A first case of meningitis/encephalitis associated with SARS-Coronavirus-2. Int J Infect Dis. 2020;94:55-58.
- Kamal YM, Abdelmajid Y, Al Madani AAR. Cerebrospinal fluid confirmed COVID-19-associated encephalitis treated successfully. BMJ Case Rep. 2020;13(9):e237378.
- Sattar SBA, Haider MA, Zia Z, Niazi M, Iqbal QZ. Clinical, radiological, and molecular findings of acute encephalitis in a COVID-19 patient: a rare case report. *Cureus*. 2020;12(9):e10650.
- Lersy F, Benotmane I, Helms J, et al. Cerebrospinal fluid features in patients with coronavirus disease 2019 and neurological manifestations: correlation with brain magnetic resonance imaging findings in 58 patients. J Infect Dis. 2021;223(4):600-609.
- Lewis A, Frontera J, Placantonakis DG, et al. Cerebrospinal fluid in COVID-19: a systematic review of the literature. *J Neurol Sci.* 2021;421:117316.
- 42. Ermis U, Rust MI, Bungenberg J, et al. Neurological symptoms in COVID-19: a cross-sectional monocentric study of hospitalized patients. *Neurol Res Pract*. 2021;3(1):17.
- 43. Clavé P, Shaker R. Dysphagia: current reality and scope of the problem. Nat Rev Gastroenterol Hepatol. 2015;12(5):259-270.
- Zhang Q, Schultz JL, Aldridge GM, Simmering JE, Narayanan NS. Coronavirus disease 2019 case fatality and Parkinson's disease. *Mov Disord*. 2020;35(11):1914-1915.
- Ferini-Strambi L, Salsone M. COVID-19 and neurological disorders: are neurodegenerative or neuroimmunological diseases more vulnerable? J Neurol. 2021;268(2):409-419.

- Louapre C, Collongues N, Stankoff B, et al. Clinical characteristics and outcomes in patients with Coronavirus disease 2019 and multiple sclerosis. JAMA Neurol. 2020;77(9):1079-1088.
- 47. Chaudhry F, Bulka H, Rathnam AS, et al. COVID-19 in multiple sclerosis patients and risk factors for severe infection. *J Neurol Sci.* 2020;418:117147.

### SUPPORTING INFORMATION

Additional supporting information may be found online in the Supporting Information section. Figure S1

Table S1 and S2

How to cite this article: Kleineberg NN, Knauss S, Gülke E, et al; the LEOSS Study Group. Neurological symptoms and complications in predominantly hospitalized COVID-19 patients: Results of the European multinational Lean European Open Survey on SARS-Infected Patients (LEOSS). *Eur J Neurol.* 2021;28:3925–3937. https://doi.org/10.1111/ene.15072