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# Large-scale profiling of antibody reactivity to glycolipids in patients with Guillain-Barré syndrome

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## 18 Abstract

Guillain-Barré syndrome is an acute polyradiculoneuropathy in which preceding infections often elicit the production of antibodies that target peripheral nerve antigens, principally gangliosides. Anti-ganglioside antibodies are thought to play a key role in the clinical diversity of the disease and can be helpful in clinical practice. Extensive research into clinical associations of individual anti-ganglioside antibody specificities has been performed. Recent research has highlighted glycolipid complexes, glycolipid combinations that may alter antibody binding, as targets. In this

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study, we investigated antibody reactivity patterns to glycolipids and glycolipid complexes using
 combinatorial array, in relation to clinical features in Guillain-Barré syndrome.

In total, 1413 patients from the observational International Guillain-Barré syndrome Outcome Study (0-91 years, 60.3% male) and 1061 controls (healthy, family, infectious, vaccination, other neurological disease) were included. Acute-phase sera from patients were screened for IgM, IgG, and IgA reactivity against 15 glycolipids and one phospholipid and their heteromeric complexes, similarly to archived control sera. Antibody specificities and reactivity patterns were analysed in relation to clinical features.

9 Of all patients, 1309 (92.6%) were positive for at least one anti-glycolipid (complex) antibody. Anti-GM1 and anti-GQ1b (complex) antibodies best distinguished motor Guillain-Barré 10 syndrome and Miller Fisher syndrome from controls, with antibodies to glycolipid complexes 11 outperforming antibodies to single glycolipids. Three models consisting of anti-glycolipid 12 (complex) antibodies distinguished patients with Guillain-Barré syndrome, the motor variant, and 13 Miller Fisher syndrome from controls with high sensitivity and specificity, performing better than 14 antibodies to single glycolipids used in clinical practice. Seven patient clusters with particular 15 antibody reactivity patterns were identified. These clusters were distinguished by geographical 16 17 region, clinical variants, preceding *Campylobacter jejuni* infection, electrophysiological subtypes, 18 the Medical Research Council sum score at study entry, and the ability to walk 10 meters unaided 19 at 26 weeks. Two patient clusters with distinct anti-GM1 (complex) reactivity (broad versus 20 restricted) differed in frequency of the axonal subtype. In cumulative incidence analyses, 15 anti-21 glycolipid (complex) antibodies were associated with the time required to regain the ability to walk 22 10 meters unaided. After adjustment for known prognostic factors, IgG anti-GQ1b:GM4, 23 GQ1b:PS, and GQ1b:Sulphatide remained associated with faster recovery. Addition of anti-24 glycolipid antibodies to clinical prognostic models slightly improved their discriminative capacity, 25 though insufficiently to improve the models.

Measurement of anti-glycolipid antibodies by combinatorial array increases the diagnostic yield compared to assaying single glycolipids, identifies clinically relevant antibody reactivity patterns to glycolipids and glycolipid complexes, and may be useful in outcome prediction in Guillain-Barré syndrome.

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## 9 Introduction

Guillain-Barré syndrome (GBS) is an acute immune-mediated polyradiculoneuropathy with an 10 incidence of approximately 1-2 cases per 100.000 person-years.<sup>1</sup> Patients most typically present 11 12 with rapidly progressive limb weakness accompanied by additional neurological symptoms 13 including cranial nerve involvement, sensory deficits, autonomic dysfunction, and respiratory insufficiency.<sup>2</sup> Disease severity may range from mild limb weakness to complete tetraparalysis 14 15 with respiratory failure.<sup>2</sup> This heterogeneity in clinical presentation complicates early diagnosis 16 and predictions of treatment response, clinical course, and outcomes. Whilst the detailed pathophysiological and immunological factors underlying this clinical diversity remain largely 17 unsolved, one major area of progress has been in the field of antibodies to glycolipids, principally 18 19 gangliosides.<sup>3</sup>

20 In approximately two-thirds of patients with GBS, neurological symptoms are preceded by an infection.<sup>4</sup> Preceding infections, notably Campylobacter jejuni, elicit the production of 21 22 antibodies that cross-react with peripheral nerve gangliosides as a result of structural identity, often 23 termed molecular mimicry.<sup>5</sup> Gangliosides are sialylated glycolipids that are abundantly present in 24 nerve cell membranes throughout the peripheral nervous system, with roles in nerve cell structure 25 and physiology.<sup>6</sup> The binding of antibodies to these gangliosides in peripheral nerves leads to complement-mediated disruption of nerve membranes in axonal and Schwann cell membranes, 26 notably at nodes of Ranvier.<sup>3, 6</sup> Consequently, nerve damage ultimately results in 27 neurophysiological changes and the development of clinical features.<sup>3, 6</sup> 28

1 Clinical associations of antibodies to gangliosides and other glycolipids in GBS have been extensively investigated since their first discovery 40 years ago.<sup>3,7</sup> Most prominently, associations 2 3 of anti-GM1 antibodies with motor-dominant GBS and anti-GQ1b antibodies with Miller Fisher syndrome (MFS) have been repeatedly described.<sup>3</sup> Antibodies to glycolipid complexes are a more 4 recent important development.<sup>3, 8, 9</sup> Existing studies have generally covered a limited range of 5 antibody specificities in small, geographically defined populations and especially antibodies to 6 glycolipid heteromeric complexes remain less extensively studied.<sup>3</sup> Therefore, comprehensive 7 8 clinical associations of antibody binding patterns to both single glycolipids and glycolipid complexes are lacking, limiting its current impact on the clinical evaluation of patients with GBS. 9

10 Combinatorial glyco-arrays, in which both single and heteromeric arrangements of glycolipids are spotted onto microarrays, are a relatively new and efficient method allowing for 11 the testing of a vast repertoire of anti-glycolipid (complex) antibodies (AGAb) in a large number 12 of samples.<sup>10</sup> Biophysical interactions between two glycolipids/gangliosides occur due to their 13 clustering properties when spotted onto artificial membranes or surfaces. This ganglioside 14 15 clustering is an important element of screening platform design and antibody discovery in this field. When two gangliosides interact to form a heteromeric cluster, this may alter the binding 16 17 capacity of an antibody to either of the single gangliosides, causing enhancement or attenuation, or may not affect binding capacity (complex independence).<sup>8,9</sup> For example, an antibody to GM1, 18 when presented as a single ganglioside, may fail to bind GM1 when clustered with GD1a; 19 20 alternatively, antibodies can be detected that only bind a GM1:GD1a complex but bind neither 21 ganglioside alone; lastly, an anti-GM1 antibody may bind GM1 irrespective of the presence or absence of GD1a. 22

In this study, we used the biobank and clinical database of the International Guillain-Barré syndrome Outcome Study (IGOS) to investigate on a large scale the presence of AGAb in glycoarrays, in relation to clinical subtypes and characteristics, preceding infections, clinical course, and outcomes in patients with GBS. In addition to studying single glycolipids, the added diagnostic and categorical value of combinatorial array over single array was investigated.

## 1 Materials and methods

#### 2 Study population

Clinical data and serum samples were acquired from patients included in IGOS, a prospective 3 multicentre cohort study including patients with GBS irrespective of the clinical variant, 4 electrophysiological subtype, and disease severity (Supplementary Fig. 1).<sup>11,12</sup> Patients with a final 5 6 diagnosis other than GBS, insufficient clinical data, more than 17 days between onset of disease 7 and inclusion, or protocol violations were excluded. Clinical data and serum samples were 8 gathered at study entry and at standard time points during at least one year of follow-up. Only 9 patients with a serum sample from study entry or week 1 available were included in analyses 10 (n=1413; Supplementary Fig. 1 and Supplementary Table 1). Clinical data that were used for analyses included demographics, clinical variants and features, disease severity, and 11 12 electrophysiological subtypes. Preceding infections associated with GBS were determined as described previously.<sup>4</sup> Electrophysiological subtypes were classified according to Hadden criteria 13 14 and determined for the first 1500 patients included in IGOS.<sup>13, 14</sup> The control population consisted of 1061 healthy (6.8%), family (27.3%), pre- and postvaccination (16.8%), infectious (Zika virus, 15 without neurological symptoms; 15.3%), and other neurological disease controls (multiple 16 sclerosis and other inflammatory neurological diseases; 33.8%) from geographically diverse 17 18 historical cohorts, including the United Kingdom (UK), United States of America, Bangladesh, and Colombia.<sup>15, 16</sup> Control samples were used to determine AGAb positivity in patients with GBS 19 and to identify AGAb that can distinguish patients from controls. 20

All patients provided written informed consent. IGOS was approved by the Institutional
 Review Board of the Erasmus MC University Medical Center Rotterdam (The Netherlands; MEC 2011-477) and by local review boards from each participating centre.

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#### 25 Antibody testing in glyco-array

Patient sera were tested for IgM, IgG and IgA against 15 individual glycolipids, including major
gangliosides, and one phospholipid (GM1, GM2, phosphatidylserine [PS], GM4, GA1, GD1a,

GD1b, GT1a, GT1b, GQ1b, GD3, sulphated glucuronyl paragloboside [SGPG], LM1, N-1 2 acetylgalactosaminyl GD1a [GalNAc-GD1a], galactocerebroside [GalC], and sulphatide) and all 3 possible 1:1 (volume:volume) glycolipid complexes in glyco-arrays (136 targets; 408 antibodies), as described previously.<sup>10</sup> Sera from the control cohorts had been screened previously, some for 4 only a subset of the glycolipid targets.<sup>15, 16</sup> Of the 136 IgG targets included on the glyco-array 5 6 panel for patients (Fig. 2), 55 (40.4% of total targets) had been tested in all controls, 65 (47.8% of 7 total targets; GM2, GM4, GT1a, GT1b, and GD3 complexes) only in non-Bangladeshi controls (n 8 = 482; 45.4% of total controls), and 16 (11.8% of total targets; GalNAc-GD1a complexes) only in UK controls (n = 178; 16.8% of total controls). IgM and IgA were screened against all 136 targets 9 10 in UK controls only (n = 98; 9.2% of total controls).

In brief, array slides were printed in-house with each unique single or complex glycolipid 11 target duplicated per array.<sup>10</sup> Slides were blocked with 2% bovine serum albumin (BSA) in 12 phosphate buffered saline solution (PBS) prior to application of individual serum samples diluted 13 one in 50 in 1% BSA in PBS.<sup>10</sup> Following washing of unbound antibody, arrays were probed 14 concomitantly with the following fluorescently conjugated, heavy chain specific, detection 15 antibodies; anti-human IgG-Alexa Fluor 647 (Jackson Immuno Research Laboratories USA, 109-16 17 605-008; 3 ug/mL), anti-human IgM-TRITC (Southern Biotech, USA, 2020-03; 3 ug/mL), and 18 anti-human IgA-FITC (Southern Biotech, USA, 2050-02; 3 ug/mL). Glyco-arrays were then washed and air dried. Fluorescent signals were sequentially detected with a GenePix 4300A 19 20 microarray scanner (Molecular Devices, USA) equipped with three lasers. For each antigen target 21 on the array, the median fluorescent signal per immunoglobulin class was calculated, from which 22 the local background signal was subtracted. As all unique targets were printed in duplicate, the 23 mean of the two values were used for all subsequent analysis. Values ranged from 150 to 65535 24 fluorescence intensity units.

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#### 26 **Statistical analyses**

#### 27 **Comparative analyses**

Comparative analyses for AGAb fluorescence intensities and clinical features were performed with
Chi-square, Fisher's exact, Mann-Whitney U, Kruskal-Wallis tests, and univariable logistic

1 regression analyses (for the latter, associations were described with odds ratios [OR] and their 95% 2 confidence intervals [CI]). Generally, an OR > 1 indicates higher fluorescence intensities in the 3 group of interest, whereas an OR < 1 indicates lower fluorescence intensities. Multiple comparisons 4 following Kruskal-Wallis tests were performed with post-hoc Dunn's tests. Correlations were 5 analysed with the Pearson correlation coefficient (r).

6

#### 7 Assessment of the diagnostic value

8 Diagnostic value of AGAb in the diagnosis of GBS was assessed with logistic regression and Receiver-Operator Characteristic (ROC) curve analyses. Discriminative performance was 9 evaluated based on the Area Under the Curve (AUC), for which a cut-off value of 0.75 was set to 10 be classified as a clinically relevant test with high sensitivity and specificity.<sup>17</sup> In addition, 11 12 bootstrapping was applied to acquire optimism-corrected C-statistics (C) and the goodness of fit (R<sup>2</sup>) of each model. The dataset was split into derivation and validation datasets for validation 13 (derivation: 80% of patients [n = 1134] and controls [n = 845]; validation: 20% of patients [n = 1134]14 279] and controls [n = 216]). Fluorescence intensities were log-transformed. 15

Univariable logistic regression analyses were employed to investigate associations of 16 17 AGAb with GBS, motor GBS, or MFS, and multivariable analyses were applied to explore whether combinations of AGAb could further improve the diagnostic value of AGAb. Final multivariable 18 19 models were acquired through backward variable selection of an initial model containing AGAb 20 that remained after univariable analyses in the derivation dataset and were tested in all controls. 21 Forward variable selection was applied to compare and validate models acquired from backward variable selection. Principal components were created to adjust for multicollinearity across 22 23 predictors in multivariable models. Generated models were validated in the validation and 24 complete datasets, and were compared to each other and to models based on antibodies currently used in clinical practice (GBS: IgG and IgM against GM1, GM2, GD1a, GD1b, and GQ1b; motor 25 GBS: IgG against GM1; MFS: IgG against GQ1b).<sup>18</sup> Since IgM and IgA were only tested in a 26 27 relatively small subset of controls, we did not include these in model generation and model 28 comparison as this would limit statistical power in complete-case analyses. Model comparison was 29 performed through analysis of variance (ANOVA) for nested models and based on the Akaike 30 information criterion (AIC) for non-nested models.

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#### 2 Clustering and heat map generation

Unsupervised hierarchical clustering was employed to explore whether AGAb reactivity patterns occur in patients with GBS. Ward's method (Ward D2) was applied to cluster both patients and AGAb based on min-max normalised (0-1) fluorescence intensities. Clusters were identified using dendrograms resulting from clustering. The optimal number of clusters was determined based on a combination of results from 26 distinct indices that each determine the optimal number of clusters, using the 'NbClust' package in RStudio, and clinical relevance.<sup>19</sup> For visualization in heatmaps, fluorescence intensities were capped at a value of 0.2.

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#### 11 Associations of complex interactions with electrophysiological subtypes

Complex interactions between glycolipids were investigated in relation to electrophysiological subtypes according to Hadden criteria (normal, demyelinating, axonal, inexcitable, or equivocal).<sup>14</sup> Complex enhancement was defined as an increased fluorescence intensity of anti-complex antibodies compared to the summed fluorescence intensities of antibodies to individual complex constituents (equation 1). Complex attenuation was defined as a decreased fluorescence intensity of anti-complex antibodies (equation 2). Anti-complex antibodies with unaltered fluorescence intensities were defined as complex independent.

- 19  $complex > (2 \times (constituent 1 + constituent 2))$  (1)
- 20  $complex < (0.5 \times (constituent 1 + constituent 2))$  (2)

Patients with fluorescence intensities below 500 U for antibodies against both complex
constituents and the complex were excluded from these analyses with the concerning complex.
This threshold was chosen based on experience from previous studies, with the lower limit of
reliable and valid detection (150 U) and assay variability taken into account.

#### 1 Assessment of prognostic value

2 The time required to regain the ability to walk 10 meters unaided was compared between patients 3 classified as positive or negative for each AGAb using cumulative incidence analyses and log-rank 4 tests. Correction for known prognostic factors (age, preceding diarrhoea and the Medical Research 5 Council [MRC] sum score at entry) was performed for log-transformed fluorescence intensities in Cox regression.<sup>20, 21</sup> Relative effects of variables in Cox regression were presented as Hazard 6 7 Ratios (HR), along with their 95% CI. HR values >1 indicate a higher probability to recover sooner, whereas values <1 indicate a higher probability to recover more slowly. In addition, we 8 9 investigated the predictive performance of AGAb and their added value to existing clinical 10 prognostic models for the prediction of regaining the ability to walk unaided by comparing the 11 discriminative capacity (Erasmus GBS Outcome Score [EGOS] and modified EGOS [mEGOS]).<sup>20-22</sup> Validation was performed in the derivation and validation datasets. 12

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#### 14 Data processing and software

Cut-off values for antibody positivity were based on the 97.5<sup>th</sup> percentile of fluorescence intensities
in controls. Two-sided *P* values <0.05 were considered statistically significant. Bonferroni</li>
corrections were applied for multiple comparisons. Missing data were not imputed. The highest
percent missing data in clinical variables was 47.9% (MRC sum score at week 13).

Statistical analyses were performed in RStudio version 2023.03.0 and GraphPad Prism
version 9.5.1. Used RStudio packages include 'stats', 'FSA', 'rms', 'pROC', "epiR", 'NbClust',
'ComplexHeatmap', and 'survival'.

## 1 **Results**

## 2 Anti-glycolipid (complex) antibodies discriminate patients from

## 3 controls

Several AGAb reactivities were able to distinguish subgroups of patients from controls, for which 4 5 antibodies to glycolipid complexes generally performed better than antibodies to single 6 glycolipids. Of all patients, 1309 (92.6%) were positive for at least one of the 408 investigated 7 IgG, IgM, and IgA antibody reactivities. In univariable analyses on the complete dataset, higher fluorescence intensities of 125 AGAb (121 IgG and four IgA) and lower fluorescence intensities 8 9 of 22 AGAb (two IgG and 20 IgM) were associated with GBS (Table 1 and Supplementary Fig. 2). Several AGAb were able to discriminate specific subgroups of patients with GBS from controls 10 11 with high sensitivity and specificity. Higher fluorescence intensities of 113 AGAb and lower 12 intensities of 18 AGAb were associated with motor GBS and higher intensities of 118 AGAb and lower intensities of 16 AGAb with MFS (n = 311 and 153 patients, respectively; Table 1 and 13 Supplementary Fig. 2). For patients with motor GBS and MFS, anti-GM1 and -GQ1b (complex) 14 antibodies respectively best distinguished them from controls. Most antibodies to GM1 and GO1b 15 complexes performed better than antibodies to GM1 or GQ1b alone (Fig. 1A-B). Addition of 16 sulphatide and GT1a to GM1 resulted in the highest performance increase for motor GBS, whereas 17 18 addition of phosphatidylserine and sulphatide to GQ1b most improved the performance for MFS. 19 Validation of these univariable analyses was performed using the derivation and validation 20 datasets (Supplementary File 1).

21 Combinations of AGAb in multivariable models further improved the diagnostic value of 22 AGAb. Backward selection of the AGAb that resulted from univariable analyses and were tested 23 in all patients and controls resulted in three models to discriminate GBS, motor GBS, or MFS from 24 controls in the derivation dataset (GBS: seven AGAb, motor GBS: two AGAb, MFS: two AGAb; 25 Supplementary Table 2). The newly created models performed better than current models based 26 on antibodies to single gangliosides (GBS: AIC = 2038 vs. 2825; motor GBS: AIC = 892 vs. 1175; 27 MFS: AIC = 417 vs. 714). At optimal thresholds, new models showed an increase in sensitivity 28 compared to current models (GBS: from 62% to 83%; motor GBS: from 53% to 72%; MFS: from 58% to 83%) while maintaining high specificity (GBS: from 79% to 81%; motor GBS: from 93% 29

to 89%; MFS: from 92% to 91%). Consequently, an additional 222/1413 (15.7%) patients with 1 GBS, 58/311 (18.6%) patients with motor GBS, and 39/153 (25.5%) patients with MFS were 2 3 diagnosed correctly using the newly created models when compared to the currently used models. 4 When applying forward instead of backward selection to create the final models, similar models 5 with comparable performance were acquired (GBS: three of seven AGAb differed [IgG against 6 GD1b:SGPG, GD1a:Sulphatide, and GA1:SGPG instead of GD1b, GM1:GD1a, and GA1:LM1], 7 AIC = 2077; motor GBS: one of two AGAb differed [IgG against GM1:Sulphatide instead of 8 GM1:GD1a], AIC = 911; MFS: two of two AGAb differed [IgG against GQ1b:SGPG and 9 GQ1b:Sulphatide instead of GQ1b:GA1 and GQ1b:GalC], AIC = 419). Notably, each of the constituent AGAb of the models acquired from backward selection were also among the most 10 strongly associated AGAb for each step of the forward selection. Application of all models 11 12 acquired from backward selection in the validation and complete (derivation and validation cohort together) datasets resulted in similar findings (Fig. 1C-E, Table 2, and Supplementary Table 2). 13

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## 15 Associations of anti-glycolipid (complex) antibodies with preceding

#### 16 infections and clinical features

A subset of AGAb was associated with clinical features in GBS (Fig. 2, Supplementary Fig. 3-5). 17 Several anti-GM1, -GalNAc-GD1a, and -GA1 (complex) antibodies were associated with 18 19 preceding diarrhoea, preceding C. jejuni infection, motor GBS, and the inability to walk 10m unaided at 26 weeks. Patients with preceding Mycoplasma pneumoniae or cytomegalovirus 20 21 infections had higher fluorescence intensities of several anti-GalC and IgM anti-GM2 (complex) antibodies, respectively. Anti-GQ1b and -GT1a (complex) antibodies were associated with 22 preceding upper respiratory tract infections and MFS. Higher fluorescence intensities of several 23 24 antibodies to GM1, GA1, GD1a, GD1b, GT1a, GT1b, GalNAc-GD1a, and SGPG (complexes) 25 correlated with lower MRC sum scores at each time point during follow-up (range of r: -0.28 to -26 0.10). Correlations were strongest for anti-GD1a and -GT1a (complex) antibodies. In contrast, 27 higher levels of antibodies targeted to GQ1b:Sulphatide, GQ1b:PS, and GQ1b:GalC correlated with higher MRC sum scores in the acute phase (range of r; 0.12 to 0.17). When excluding patients 28 29 with MFS, the latter correlations were no longer present.

## 1 Cluster analysis of anti-glycolipid (complex) antibodies and clinical

#### 2 associations of clusters

3 Following clustering based on fluorescence intensities, seven patient clusters with particular IgG 4 AGAb reactivity patterns were identified (A: broad -ranging GalNAc-GD1a reactivity, B: restricted GA1 and broad-ranging GM1 reactivity, C: restricted GalNAc-GD1a reactivity, D: restricted GA1, 5 6 GD1b, and GM1 reactivity, E: nonspecific, F: restricted GQ1b and GT1a reactivity, and G: broad -7 ranging GT1a reactivity; Fig. 3). Broad-ranging clusters had reactivity against the majority of complexes containing a specific glycolipid, whereas restricted clusters had reactivity against 8 9 specific glycolipids in the presence of sulphatide and PS. All patients that were negative for all investigated AGAb (n = 104, 7.4%) were included in the nonspecific cluster E. In the other clusters, 10 all patients had antibody reactivity against at least 17 AGAb. Patient clusters were clinically 11 distinct, differing in geographical regions, proportions of GBS forms and variants, preceding 12 infection serology, cranial nerve involvement at study entry, and the clinical course (Table 3). 13 Cluster G consisted of a relatively high proportion of Argentinian patients that were included 14 15 between 2013 and 2015 (n = 11, 28.2%), of which the majority had a preceding C. *jejuni* infection (10/11, 90.9%). Furthermore, patients in cluster G were younger than patients in clusters A, B, D, 16 E, and F (median age: 28 vs 48 – 54; range of  $P = \langle 0.001 - 0.014 \rangle$  and patients in cluster E had 17 higher MRC sum scores at study entry than patients in clusters B, D, and G (median: 48 vs 32 – 18 37; range of  $P = \langle 0.001 - 0.002 \rangle$  and patients in cluster F had higher MRC sum scores at study 19 entry than patients in all other clusters (median: 60 vs 32-48; P < 0.001). Notably, two clusters 20 21 with particular anti-GM1 (complex) antibody reactivity patterns (clusters B and D) were clinically distinct. Three clusters predominantly containing patients with motor GBS (clusters A, C, and D) 22 23 also had distinct clinical features.

When further investigating patients from cluster E, including patients without a particular AGAb reactivity pattern and with predominantly motor-sensory GBS, several subclusters were identified (E-a: nonspecific, E-b: broad-ranging GalC reactivity, E-c: restricted GD1a and GT1a reactivity, E-d: restricted reactivity to GM1:GT1a, and E-e: restricted reactivity to GM1 and GA1; Supplementary Fig. 6). All patients that were negative for all investigated AGAb were included in the nonspecific cluster E-a. Most notable among these subclusters was a cluster with AGAb reactivity against GalC complexes (cluster E-b), which was associated with positive *M*. *pneumoniae* serology (Supplementary Table 3). When performing clustering analyses using
 antibodies to GD1b, GT1a, GT1b, GQ1b, GD3, and LM1 (complexes) only, still no patient clusters
 specific for any of these antibody reactivities could be found.

4

## 5 Distinction of electrophysiological subtypes based on anti-glycolipid

#### 6 (complex) antibodies

7 Electrophysiological subtypes were associated with various AGAb (Fig. 2, Supplementary Fig. 3-8 5). Patients with normal and equivocal nerve conduction studies had higher fluorescence intensities 9 of some anti-GQ1b and -GT1a (complex) antibodies (IgG against GT1a:PS, GQ1b:PS, GO1b:GM4, GO1b:GT1a, GT1a:GalC, GT1a:Sulph, GO1b:GT1b, GT1b:Sulph, GO1b:GD3, 10 11 GQ1b:SGPG, GQ1b:LM1, GQ1b:GalC, and GQ1b:Sulph; IgA against GQ1b:GalC and 12 GQ1b:Sulph), the demyelinating subtype was associated with lower intensities of these same AGAb groups (IgG against GQ1b:PS, GT1a:PS, GT1a:GM4, GQ1b:GM4, GT1a:GA1, 13 GQ1b:GA1, GQ1b:GD1a, GQ1b:GD1b, GD1b:Sulph, GT1a:GalC, GT1a:Sulph, GQ1b:GT1b, 14 GO1b:GD3, GO1b:LM1, GO1b:GalC, and GO1b:Sulph), and the axonal and inexcitable subtypes 15 16 were associated with the presence of anti-GM1, -GA1 and -GalNAc-GD1a (complex) antibodies (IgG against GM1, GA1, GM1:GM2, GM1:PS, GM1:GM4, GM1:GA1, GM1:GD1a, GM1:GD1b, 17 18 GM1:GT1b, GM1:GQ1b, GM1:GD3, GM1:SGPG, GM1:GalNAc-GD1a, GM1:GalC, GM1:Sulph, GA1:PS, GA1:GM4, GA1:GalNAc-GD1a, GA1:Sulph, GalNAc-GD1a:GD1b, 19 20 GalNAc-GD1a:GT1a, and SGPG:Sulph; IgM against GM1:PS, GM1:GM4, GM1:Sulph, GA1:GM4, and GA1:GalNAc-GD1a; IgA against GM1:PS and GM1:Sulph). Anti-GM1 21 22 (complex) antibody fluorescence intensities differed across electrophysiological subtypes (Fig. 23 4A). Notably, these antibodies occurred in each subtype with broad ranges of intensities. 24 Moreover, proportions of electrophysiological subtypes differed across patient clusters based on 25 antibody reactivity patterns and also across the two patient clusters with particular anti-GM1 (complex) reactivity (all clusters: P < 0.001 anti-GM1 clusters: P = 0.008, Fig. 4B; Table 3). 26

The complex interaction of GM1 with GD1a varied across patients with different electrophysiological subtypes (Fig. 4C). However, the proportions of these subtypes did not differ between groups based on complex interaction (Fig. 4D). Proportions of electrophysiological 1 subtypes did differ for complex interactions of GM1 with PS (enhanced: 21.8% axonal, attenuated: 2 6.6% axonal, independent: 9.6% axonal; P = 0.001).

3

## 4 **Prognostic value of anti-glycolipid (complex) antibodies**

5 Positivity of 15 AGAb was associated with the time required to regain the ability to walk 10 meters 6 unaided. Patients positive for IgG antibodies against GM1:Sulphatide, GM1:SGPG, GM1:GD1b, 7 GM1:GalC, GM1:GalNAc-GD1a, GalNAc-GD1a:GalC, GM1:GD3, GM1:GM4, GA1:PS, GM1:GT1b, and GalNAc-GD1a:GD1b as well as IgA against GM1:Sulphatide required more time 8 to regain this ability, whereas patients positive for IgG against GQ1b:GM4, GQ1b:PS, and 9 GO1b:Sulphatide reached this end point more rapidly (range of  $P = 0.045 - \langle 0.001;$  Fig. 5A-C). 10 11 Following adjustment of fluorescence intensities for known prognostic factors (age, preceding 12 diarrhoea, MRC sum score at entry), associations remained for IgG antibodies against GQ1b:GM4, GQ1b:PS, and GQ1b:Sulphatide (*HR* [95% CI] = 1.56 [1.28-1.92], 1.50 [1.27-1.77], and 1.36 13 [1.15-1.60]; P < 0.001, < 0.001, and 0.004). When excluding patients with MFS, positivity of four 14 AGAb was associated with requiring more time to regain the ability to walk 10 meters unaided 15 16 (IgG antibodies against GM1:Sulphatide, GM1:GD1b, GM1:SGPG, and GM1:GalC; range of P =0.049 - 0.011). Yet, none of these associations remained after adjusting for known prognostic 17 18 factors, mainly due to the prognostic value of the MRC sum score at entry. Across patient clusters 19 acquired from hierarchical clustering, the time required to regain the ability to walk 10 meters 20 unaided was different (Fig. 5D).

21 A subset of AGAb was associated with the inability to walk 10 meters unaided at 4 and 26 22 weeks in the complete dataset (at 4 weeks [n = 4]: IgG antibodies against GQ1b:PS, 23 GQ1b:Sulphatide, GQ1b:GalC, and GQ1b:GM4; at 26 weeks [n = 17, top four]: IgG antibodies 24 against GM1:GalC, GM1:Sulphatide, GM1, and GM1:SGPG). Replication of these analyses in the 25 derivation and validation datasets provided similar results in the derivation dataset but not in the 26 validation dataset. Addition of 110 AGAb to the mEGOS at week 1 predicting the inability to walk 10 meters unaided at 26 weeks increased the AUC of the model in the derivation, validation, and 27 28 complete datasets (highest  $\triangle AUC$  in the complete dataset = 0.01 [0.83 to 0.84; IgA anti-GM2:PS]. 29 Similarly, addition of 199 AGAb to the mEGOS at study entry and 285 AGAb to the EGOS

1 increased their AUC for the same outcome in all three datasets (mEGOS at study entry: highest 2  $\Delta AUC$  in the complete dataset = 0.01 [0.78 to 0.79; IgG anti-GQ1b:PS], EGOS: highest  $\Delta AUC$  in 3 the complete dataset = 0.02 [0.87 to 0.89; IgG anti-GM1:GalC]). However, these increases were 4 insufficient to improve the predictive value.

5

## 6 **Discussion**

7 In this study, we determined an extensive repertoire of AGAb on glyco-array in a large prospective 8 cohort of patients with GBS and related these to the diagnosis, clinical variants, 9 electrophysiological subtypes, clinical course, and outcome. We found that several antibodies against glycolipid complexes were able to distinguish motor GBS and MFS from controls more 10 11 accurately than antibodies to single glycolipids. Moreover, combining multiple AGAb further 12 improved their discriminative capacity, outperforming AGAb currently tested in clinical practice. 13 Notably, we identified seven particular AGAb reactivity patterns with broad or restricted reactivities and distinct clinical phenotypes, of which two had specific anti-GM1 (complex) 14 reactivity. Anti-GM1 (complex) antibodies were distributed amongst patients with all 15 electrophysiological subtypes. Positivity of a subset of AGAb was associated with the clinical 16 17 course and outcome, and the addition of several AGAb slightly improved the predictive value of current clinical prognostic models. 18

19 Several previous studies with comparable methodology have reported similar findings.<sup>16,</sup> 23, 24 20 In these studies, glyco-arrays with varying AGAb panels, also including antibodies to 21 glycolipid complexes, were employed to assess the occurrence of AGAb in patients with GBS. A 22 subset of the tested AGAb was associated with GBS. Although the exact AGAb for which these 23 associations were found differed between studies and from our study, the trend in specific 24 glycolipids within glycolipid complexes was reproducible. For example, there was a consistently 25 observed association between the type of preceding infection (with C. *jejuni*, M. pneumoniae, and 26 CMV) and AGAb (to GM1/GQ1b, GalC, and GM2, respectively). Moreover, several clinical 27 associations of AGAb subsets were described previously, which were similar to the current 28 findings. In our study, we were able to test sera from a large, diverse, prospective, clinically well-29 defined cohort of patients for an AGAb panel including additional gangliosides and other glycolipids for IgG, IgM, and IgA. As a result of this increased statistical power, previous findings
 could be confirmed and additional analyses could be performed.

3 Taken together, our study and previous studies provide evidence that not only one or a 4 limited set of antibody specificities may play a role in the pathophysiology of GBS variants, but 5 rather reactivity to a large number of antibody specificities together (including glycolipid 6 complexes). Notably, antibodies to glycolipid complexes often had stronger clinical associations 7 than antibodies to single glycolipids and may thus play an important role in the pathophysiology. 8 Sulphatide and PS repeatedly appeared to enhance complex reactivity most potently, which may 9 result from an inherently high ability to modify the accessibility or conformation of epitopes or from their anatomical distribution alongside gangliosides.<sup>3, 8, 9</sup> 10

11 Despite the identification of clear antibody reactivity patterns, some overlap in antibody 12 reactivity was present across patient clusters. This could be a limitation of the applied clustering 13 method. Since a limited number of antibody reactivity clusters were created, the algorithm may have preferentially clustered some AGAb over others. Though further clustering into a higher 14 number of clusters may have provided even more specific clusters, this would have reduced 15 statistical power and would have introduced clinically irrelevant clusters. Alternatively, the 16 overlap in antibody reactivities could indicate that multiple clones of antibodies may be involved 17 in the pathophysiology of GBS, but further research into this hypothesis is required. 18

19 The variety of AGAb specificities found in the current study may challenge their role in 20 the pathogenesis of GBS, since they could reflect an epiphenomenon resulting from nerve damage 21 or generally increased immune activity following a preceding infection.<sup>3</sup> An alternative viewpoint 22 for the pathogenesis of GBS is that neuronal damage is a consequence of endoneurial ischemia resulting from inflammatory oedema in nerve trunks with epi-perineurium.<sup>25</sup> However, the 23 numerous clinical associations of AGAb in GBS in the current and previous studies substantiate 24 25 existing evidence for the pathogenicity of AGAb in GBS. Extensive studies into the pathogenicity of these antibodies have been performed in recent decades, using in vitro, ex vivo, and in vivo 26 animal models and human studies.<sup>3</sup> Several studies have looked into the pathogenicity of anti-27 GM1 antibodies, showing that these antibodies cause GBS-like syndromes in rabbits and mice.<sup>26-</sup> 28 <sup>30</sup> Other antibodies that have been shown to induce symptoms similar to GBS in animal models 29 include anti-GD1a, anti-GalC, anti-GD1b, and anti-GQ1b antibodies.<sup>31-37</sup> Although some studies 30

have looked into anti-complex antibodies, the pathogenicity of these antibodies remains to be further studied in animal models.<sup>3</sup> Importantly, it should not be assumed that any or all of the described glycolipid complexes exist in vivo. Rather, the molecular shapes of glycolipids that allow for antibody binding can be manipulated in a wide variety of ways by cooperative lipids.<sup>38,</sup> <sup>39</sup> The biophysical basis for this phenomenon in living neural membranes has not been studied in detail. All evidence considered, at least for a subset of AGAb there is strong evidence that they are pathogenic.

8 Due to the focus of pathogenicity studies on IgG antibodies, it remains unclear whether IgM and IgA antibodies could be pathogenic in GBS. Interestingly, we found that patients with 9 10 GBS had lower fluorescence intensities of multiple IgM antibodies than controls and that fluorescence intensities of several IgM and IgA antibodies were associated with clinical features 11 in this study. The lower IgM fluorescence intensities in patients with GBS could be explained by 12 the nature of included controls, since a natural occurrence of IgM AGAb has been described in 13 healthy adults and IgM AGAb have been shown to be elevated in other neurological diseases such 14 15 as multifocal motor neuropathy.<sup>40-42</sup> Alternatively, IgM could be downregulated in patients with GBS due to the relative upregulation of IgG, or could be consumed or cleared from the circulation 16 following antigen binding, but this remains to be further investigated. Although research on the 17 18 role of IgA antibodies in GBS remains scarce, our study and several other studies provide evidence for a role of this isotype in the pathophysiology.<sup>5, 43, 44</sup> These IgA clinical associations may be 19 specifically related to preceding (gastro-intestinal) infections. 20

21 Despite the presence of patient clusters with specific antibody reactivity patterns, the 22 majority of patients in this study clustered in a cluster without characterizing antibody reactivity 23 (cluster E-a). Patients in this cluster were predominantly included from Europe, frequently had 24 motorsensory and demyelinating GBS, and had a low frequency of preceding infections. Relatively 25 low frequencies of specific triggers or host factors for certain antibody reactivity patterns in some 26 (European) regions may explain the absence of these patterns in this group of patients. Moreover, the pathophysiology of GBS in these patients may differ from patients with antibody reactivity 27 28 patterns. Other anti-glycolipid antibodies, or antibodies against other types of targets, that were 29 not included in the antibody panel that we tested for this study may be involved. Alternatively, 30 antibodies that may play a role in the pathophysiology of these patients could potentially be better detected with different ratios of complexes (e.g. 1:2 [volume:volume]) or an increased number of 31

glycolipids in complex (e.g. three glycolipids). On the other hand, these patients may have a more
 T-cell driven pathophysiology instead of one driven by pathogenic antibodies.<sup>45</sup> Further studies
 are required to elucidate the pathophysiological mechanisms occurring in this group of patients
 with GBS.

5 Altogether, we describe several findings that could potentially improve diagnostics, 6 prognostics, and treatment strategies for patients with GBS. Firstly, AGAb may be useful in 7 patients with an atypical clinical presentation or differential diagnoses. Several antibodies to single gangliosides are already being tested in these cases.<sup>18</sup> However, their sensitivity and specificity are 8 limited, and antibodies to glycolipid complexes could have a higher diagnostic value according to 9 10 our findings. Secondly, our findings challenge the historical concept that anti-GM1 (complex) 11 antibodies predominantly cause axonal GBS.<sup>3</sup> We found that these antibodies occur in all electrophysiological subtypes with a broad range of fluorescence intensities and that the proportion 12 13 of patients with the axonal subtype differed across antibody reactivity patterns (including two anti-GM1 (complex) reactivity patterns). These findings could be explained by the differential 14 anatomical distribution of different GM1 complexes on the axon and myelin or by differences in 15 disease severity across electrophysiological subtypes.<sup>3, 8, 9</sup> Thirdly, AGAb may potentially be 16 17 useful in improving outcome prediction in patients with GBS, alongside or in combination with current clinical prognostic models.<sup>20, 21</sup> In our study, AGAb only slightly increased the AUC of 18 current prognostic models ([m]EGOS), which may be related to their associations with 19 20 incorporated clinical features. Their predictive potential could be further explored using other 21 methods (such as machine learning), by addition of multiple AGAb, or by combining AGAb with 22 other clinical features. Fourthly, AGAb reactivity patterns may reflect endemics of microbes that 23 are able to elicit the production of cross-reactive antibodies and subsequently cause GBS, as we 24 described for the relatively high proportion of Argentinian patients with a preceding C. jejuni 25 infection in patient cluster G (broad GT1a reactivity). Lastly, determining AGAb reactivity 26 patterns could potentially help identify patients who may benefit from additional or alternative 27 treatments.

Future implementation of antibody testing for the AGAb that we found to be clinically relevant into clinical practice could be feasible, though additional studies are required. For diagnostic purposes, a set of antibodies could be confined to nine AGAb to distinguish GBS, motor GBS, and MFS from controls (GD1b, GQ1b, SGPG, GM1:GD1a, GA1:LM1, GA1:Sulph,

GalC:LM1, GQ1b:GA1, and GQ1b:GalC). Alternatively, addition of sulphatide or PS to 1 2 gangliosides currently used in clinical practice, such as GM1, could already improve their 3 diagnostic value. In addition, some of these nine and several other AGAb, as well as AGAb 4 reactivity patterns, could potentially be used for the other described purposes, such as improving 5 prognostics and treatment strategies. Testing these antibodies on glyco-array could be feasible, though antibody detection in enzyme-linked immunosorbent assay (ELISA) may be more 6 7 accessible for clinical practice, as the vast majority of laboratories are conversant with this method. 8 Generally, results from both methods correlate, though in a small number of cases a different result 9 could be obtained. Validation of our findings in ELISA would therefore be required prior to 10 implementation into clinical routines.

Our study had several limitations. Firstly, missing clinical data and serum samples in 11 subsets of patients and controls may have led to some selection bias and to limited statistical power. 12 Likewise, the use of week 1 samples if study entry samples were not available may also have 13 introduced some bias. However, in preliminary subgroup analyses, AGAb fluorescence intensities 14 did not differ between the sets of samples from study entry versus week 1 and were only higher 15 16 for IgG anti-GM2 and IgG anti-Sulphatide in posttreatment versus pretreatment samples. 17 Secondly, the applicability of our control cohorts in diagnostics was limited. Patients with diseases 18 that specifically mimic GBS variants would be preferred controls for diagnostic analyses over healthy, family, vaccination, and other neurological disease controls. Moreover, including IgM 19 20 and IgA AGAb from control cohorts with sufficient statistical power could provide further 21 possibilities to improve diagnostic models. Thirdly, a high proportion of patients with GBS, in 22 particular those with viral preceding infections, have no detectable AGAb. These patients may have an alternative immunological mechanism.<sup>45</sup> Likewise, functional characteristics of antibodies 23 24 that could affect the found associations, such as affinity, subclass, and the ability to elicit complement activation, were not studied. 25

In conclusion, combinatorial array has added value over single array in diagnostics, enabled the identification of AGAb reactivity patterns with distinct clinical phenotypes, and may have added value in prognostics. Importantly, anti-GM1 (complex) antibodies occur in patients with any electrophysiological subtype, despite their particular association with axonal pathology. Further studies are required to validate these finding externally.

## 1 Data availability

Data of patients included in IGOS will be used for future studies and may be made available on
reasonable request after consulting the IGOS Steering Committee. Raw AGAb fluorescence
intensity unit data may be made available on reasonable request through the IGOS website
(https://www.igosresearch.com/).

6

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12

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18

## 19 Competing interests

RCMT, SKH, LCK, EJAW, DSG, APTG, WR, HA, GA, SAr, SAt, FAB, KJB, LB, PVB, JB, MB,
CC, ED, AD, TEF, JF, GG, TGS, GGG, TH, HPH, IH, ZI, SuKa, HDK, NK, HCL, SEL, LMA,
SM, ENO, JP, YP, RCRe, SR, RCRo, OS, NS, NJS, SHS, BS, CYT, HT, LHV, WW, BCJ, and
HJW report no competing interests. VG is currently an employee of Biohaven Pharmaceuticals.
RDMH received honoraria from Takeda, CSL Behring, ArgenX, and Dianthus Therapeutics.
JKLH has served on advisory boards and received support to attend conferences from CSL Behring
and Takeda outside the submitted work. SuKu received honoraria from CSL Behring, Japan Blood

Product Organization, Takeda Pharmaceuticals, and KMBiologics; served on the data and safety 1 2 monitoring board for ArgenX. SaKu received honoraria from CSL Behring, ArgenX, and Takeda 3 Pharmaceuticals outside the submitted work. MK received speaker honoraria from CSL Behring, 4 Japan Blood Product Organization, and Takeda Pharmaceuticals. LQ received speaker or expert 5 testimony honoraria from CSL Behring, Novartis, Sanofi-Genzyme, Merck, Annexon, Alnylam, Janssen, ArgenX, UCB, Dianthus Therapeutics, LFB, Avilar Therapeutics, Nuvig Therapeutics, 6 7 Takeda, and Roche; was supported by Instituto de Salud Carlos III - Ministry of Economy and 8 Innovation (Spain), CIBERER, Fundació La Marató, GBS-CIDP Foundation International, UCB, 9 ArgenX, and Grifols; serves at Clinical Trial Steering Committees for Sanofi Genzyme, Takeda, and ArgenX and was Principal Investigator for UCB's CIDP01 trial. PR served on advisory boards 10 for UCB, ArgenX, Biogen, Alexion, and Roche outside the submitted work. KAS was supported 11 12 by Grifols (Grifols Investigator-Sponsored Research, 8/31/15-8/30/17). RH was supported by GBS-CIDP Foundation International and the T2B collaboration project funded by PPP Allowance 13 made available by Top Sector Life Sciences & Health to Samenwerkende Gezondheidsfondsen 14 (SGF) under project number LSHM18055-SGF to stimulate public-private partnerships and co-15 16 financing by health foundations that are part of the SGF.Health~Holland.

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## 18 Supplementary material

19 Supplementary materials are available at *Brain* online.

20

# 21 Appendix 1

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## 26 **References**

Shahrizaila N, Lehmann HC, Kuwabara S. Guillain-Barré syndrome. *Lancet*.
 2021;397(10280):1214-1228.

1	2.	Leonhard SE, Mandarakas MR, Gondim FAA, et al. Diagnosis and management of
2		Guillain-Barré syndrome in ten steps. Nat Rev Neurol. 2019;15(11):671-683.
3	3.	Kusunoki S, Willison HJ, Jacobs BC. Antiglycolipid antibodies in Guillain-Barré and
4		Fisher syndromes: discovery, current status and future perspective. J Neurol Neurosurg
5		Psychiatry. 2021;92(3):311-318.
6	4.	Leonhard SE, van der Eijk AA, Andersen H, et al. An International Perspective on
7		Preceding Infections in Guillain-Barré Syndrome: The IGOS-1000 Cohort, Neurology.
8		2022;99(12):e1299-e1313.
9	5.	Laman JD, Huizinga R, Boons GJ, Jacobs BC. Guillain-Barré syndrome: expanding the
10		concept of molecular mimicry. Trends Immunol. 2022;43(4):296-308.
11	6.	Cutillo G, Saariaho AH, Meri S. Physiology of gangliosides and the role of antiganglioside
12		antibodies in human diseases. Cell Mol Immunol. 2020;17(4):313-322.
13	7.	Ilyas AA, Willison HJ, Quarles RH, et al. Serum antibodies to gangliosides in Guillain-
14		Barré syndrome. Ann Neurol. 1988;23(5):440-447.
15	8.	Kaida K, Morita D, Kanzaki M, et al. Ganglioside complexes as new target antigens in
16		Guillain-Barré syndrome. Ann Neurol. 2004;56(4):567-571.
17	9.	Kusunoki S, Kaida K, Ueda M. Antibodies against gangliosides and ganglioside complexes
18		in Guillain-Barré syndrome: new aspects of research. Biochim Biophys Acta.
19		2008;1780(3):441-444.
20	10.	Halstead SK, Gourlay D, Willison HJ. Detection of Autoantibodies Using Combinatorial
21		Glycolipid Microarrays. In: Kilcoyne M, Gerlach JQ, eds. Glycan Microarrays. Methods
22		Mol Biol; 2022:183-191.
23	11.	Doets AY, Verboon C, van den Berg B, et al. Regional variation of Guillain-Barré
24	Y	syndrome. Brain. 2018;141(10):2866-2877.
25	12.	Jacobs BC, van den Berg B, Verboon C, et al. International Guillain-Barré Syndrome
26		Outcome Study: protocol of a prospective observational cohort study on clinical and
27		biological predictors of disease course and outcome in Guillain-Barré syndrome. J
28		Peripher Nerv Syst. 2017;22(2):68-76.

- Arends S, Drenthen J, van den Bergh P, *et al.* Electrodiagnosis of Guillain-Barré syndrome
   in the International GBS Outcome Study: Differences in methods and reference values.
   *Clin Neurophysiol.* 2022;138: 231-240.
- 4 Hadden RD, Cornblath DR, Hughes RA, et al. Electrophysiological classification of 14. associations 5 Guillain-Barré syndrome: clinical and outcome. Plasma 6 Exchange/Sandoglobulin Guillain-Barré Syndrome Trial Group. Ann Neurol. 7 1998;44(5):780-788.
- 8 15. Davies AJ, Lleixà C, Siles AM, *et al.* Guillain-Barré Syndrome Following Zika Virus
  9 Infection Is Associated With a Diverse Spectrum of Peripheral Nerve Reactive Antibodies.
  10 Neurol Neuroinflamm. 2022;10(1):e200047.
- Halstead SK, Kalna G, Islam MB, *et al.* Microarray screening of Guillain-Barré syndrome
   sera for antibodies to glycolipid complexes. *Neurol Neuroimmunol Neuroinflamm*.
   2016;3(6):e284.
- 14 17. Jones CM, Athanasiou T. Summary receiver operating characteristic curve analysis
  15 techniques in the evaluation of diagnostic tests. *Ann Thorac Surg.* 2005;79(1):16-20.
- 16 18. van Doorn PA, Van den Bergh PYK, Hadden RDM, *et al.* European Academy of
  17 Neurology/Peripheral Nerve Society Guideline on diagnosis and treatment of Guillain18 Barré syndrome. *Eur J Neurol.* 2023;30(12):3646-3674.
- Charrad M, Ghazzali N, Boiteau V, Niknafs A. NbClust: An R Package for Determining
   the Relevant Number of Clusters in a Data Set. *Journal of Statistical Software*.
   2014;61(6):1-36.
- 22 20. van Koningsveld R, Steyerberg EW, Hughes RAC, Swan AV, van Doorn PA, Jacobs BC.
   23 A clinical prognostic scoring system for Guillain-Barré syndrome. *Lancet Neurol*.
   24 2007;6(7):589-594.
- 25 21. Walgaard C, Lingsma HF, Ruts L, van Doorn PA, Steyerberg EW, Jacobs BC. Early
  26 recognition of poor prognosis in Guillain-Barré syndrome. *Neurology*. 2011;76(11):96827 975.

- Doets AY, Lingsma HF, Walgaard C, *et al.* Predicting Outcome in Guillain-Barré
   Syndrome: International Validation of the Modified Erasmus GBS Outcome Score.
   *Neurology.* 2022;98(5):e518-e532.
- 4 23. Morikawa M, Kuwahara M, Ueno R, Samukawa M, Hamada Y, Kusunoki S. Serological
  5 study using glycoarray for detecting antibodies to glycolipids and glycolipid complexes in
  6 immune-mediated neuropathies. *J Neuroimmunol*. 2016;301:35-40.
- 7 24. Rinaldi S, Brennan KM, Kalna G, *et al.* Antibodies to heteromeric glycolipid complexes
  8 in Guillain-Barré syndrome. *PLoS One*. 2013;8(12):e82337.
- 9 25. Berciano J. The pathophysiological role of endoneurial inflammatory edema in early
  10 classical Guillain-Barré syndrome. *Clin Neurol Neurosurg*. 2024;237:108131.
- Lopez PH, Zhang G, Zhang J, *et al.* Passive transfer of IgG anti-GM1 antibodies impairs
   peripheral nerve repair. *J Neurosci.* 2010;30(28):9533-9541.
- Yuki N, Susuki K, Koga M, *et al.* Carbohydrate mimicry between human ganglioside GM1
   and Campylobacter jejuni lipooligosaccharide causes Guillain-Barré syndrome. *Proc Natl Acad Sci U S A.* 2004;101(31):11404-11409.
- Yuki N, Yamada M, Koga M, *et al.* Animal model of axonal Guillain-Barré syndrome
  induced by sensitization with GM1 ganglioside. *Ann Neurol.* 2001;49(6):712-720.
- Sheikh KA, Zhang G, Gong Y, Schnaar RL, Griffin JW. An anti-ganglioside antibodysecreting hybridoma induces neuropathy in mice. *Ann Neurol.* 2004;56(2):228-239.
- 30. Susuki K, Rasband MN, Tohyama K, *et al.* Anti-GM1 antibodies cause complement mediated disruption of sodium channel clusters in peripheral motor nerve fibers. J
   *Neurosci.* 2007;27(15):3956-3967.
- 31. Kusunoki S, Chiba A, Hitoshi S, Takizawa H, Kanazawa I. Anti-Gal-C antibody in autoimmune neuropathies subsequent to mycoplasma infection. *Muscle Nerve*.
  1995;18(4):409-413.
- 32. Nagai Y, Momoi T, Saito M, Mitsuzawa E, Ohtani S. Ganglioside syndrome, a new autoimmune neurologic disorder, experimentally induced with brain gangliosides. *Neurosci Lett.* 1976;2(2):107-111.

1 2	33.	Saida T, Saida K, Dorfman SH, <i>et al.</i> Experimental allergic neuritis induced by sensitization with galactocerebroside. <i>Science</i> . 1979;204(4397):1103-1106.
3 4 5	34.	Kusunoki S, Shimizu J, Chiba A, Ugawa Y, Hitoshi S, Kanazawa I. Experimental sensory neuropathy induced by sensitization with ganglioside GD1b. <i>Ann Neurol.</i> 1996;39(4):424-431.
6 7	35.	Plomp JJ, Molenaar PC, O'Hanlon GM, <i>et al.</i> Miller Fisher anti-GQ1b antibodies: alpha- latrotoxin-like effects on motor end plates. <i>Ann Neurol.</i> 1999;45(2):189-199.
8 9	36.	Halstead SK, Zitman FMP, Humphreys PD, <i>et al.</i> Eculizumab prevents anti-ganglioside antibody-mediated neuropathy in a murine model. <i>Brain.</i> 2008;131(Pt 5):1197-1208.
10 11	37.	Takada K, Shimizu J, Kusunoki S. Apoptosis of primary sensory neurons in GD1b-induced sensory ataxic neuropathy. <i>Exp Neurol.</i> 2008;209(1):279-283.
12 13 14	38.	Greenshields KN, Halstead SK, Zitman FMP, <i>et al.</i> The neuropathic potential of anti-GM1 autoantibodies is regulated by the local glycolipid environment in mice. <i>J Clin Invest.</i> 2009;119(3):595-610.
15 16 17	39.	Zitman FMP, Greenshields KN, Kuijf ML, <i>et al.</i> Neuropathophysiological potential of Guillain-Barré syndrome anti-ganglioside-complex antibodies at mouse motor nerve terminals. <i>Clin Exp Neuroimmunol.</i> 2011;2(3):59-67.
18 19	40.	Mizutamari RK, Wiegandt H, Nores GA. Characterization of anti-ganglioside antibodies present in normal human plasma. <i>J Neuroimmunol</i> . 1994;50(2):215-220.
20 21	41.	Willison HJ, Yuki N. Peripheral neuropathies and anti-glycolipid antibodies. <i>Brain</i> . 2002;125(Pt 12):2591-2625.
22 23 24	42.	Budding K, Bos JW, Dijkxhoorn K, <i>et al.</i> IgM anti-GM2 antibodies in patients with multifocal motor neuropathy target Schwann cells and are associated with early onset. <i>J Neuroinflammation</i> . 2024;21(1):100.
25 26	43.	van Sorge NM, Yuki N, Koga M, <i>et al.</i> Ganglioside-specific IgG and IgA recruit leukocyte effector functions in Guillain-Barré syndrome. <i>J Neuroimmunol.</i> 2007;182(1-2):177-184.
27 28	44.	Ilyas AA, Mithen FA, Chen ZW, Cook SD. Anti-GM1 IgA antibodies in Guillain-Barré syndrome. <i>J Neuroimmunol</i> . 1992;36(1):69-76.

Súkeníková L, Mallone A, Schreiner B, *et al.* Autoreactive T cells target peripheral nerves
 in Guillain-Barré syndrome. *Nature*. 2024;626(7997):160-168.

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## 4 Figure legends

Figure 1 Comparison of receiver operating characteristic curves for models distinguishing 5 6 patients with Guillain-Barré syndrome, motor Guillain-Barré syndrome, or Miller Fisher 7 syndrome from controls. Receiver operating characteristic curves are shown with associated 8 values for the area under the receiver operating characteristic curve, for univariable models (A and **B**) and multivariable models (C-E). Using univariable models, the differentiating performance of 9 IgG anti-GM1 complex antibodies and IgG anti-GQ1b complex antibodies were compared to IgG 10 11 antibodies to GM1 or GQ1b alone for the distinction of motor Guillain-Barré syndrome (A) or Miller Fisher syndrome (B) from controls. Additionally, newly created multivariable models 12 containing antibodies to both single gangliosides and ganglioside complexes were compared to 13 currently used multivariable models based on antibodies to single gangliosides, for the distinction 14 of Guillain-Barré syndrome (C), motor Guillain-Barré syndrome (D), or Miller Fisher syndrome 15 (E) from controls. GBS: Guillain-Barré syndrome, Sulph: sulphatide, GN-GD1a: N-16 17 acetylgalactosaminyl GD1a, PS: phosphatidylserine, GalC: galactocerebroside, SGPG: sulphated glucuronyl paragloboside, MFS: Miller Fisher syndrome, AUC: area under the receiver operator 18 characteristic curve. 19

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Figure 2 Forest plots depicting the top five anti-glycolipid (complex) antibodies associated 21 22 with several clinical features in patients with Guillain-Barré syndrome. Associations of anti-23 glycolipid antibodies with motor Guillain-Barré syndrome, Miller Fisher syndrome, bulbar palsy 24 at study entry, the axonal subtype, and preceding *Campylobacter jejuni* and *Mycoplasma* 25 pneumoniae infections. Values indicate the odds ratio with their 95% confidence interval per anti-26 glycolipid antibody. Antibodies were ranked based on the p value resulting from univariable logistic regression analyses. GBS: Guillain-Barré syndrome, PS: phosphatidylserine, GalNAc-27 28 GD1a: N-acetylgalactosaminyl GD1a, Sulph: sulphatide, MFS: Miller Fisher syndrome, GalC: galactocerebroside, CJ: Campylobacter jejuni, MP: Mycoplasma pneumoniae. 29

2 Figure 3 Heat map depicting patient clusters with particular IgG anti-glycolipid antibody 3 reactivity patterns derived from unsupervised hierarchical clustering of anti-glycolipid 4 antibodies in patients with Guillain-Barré syndrome. Patients were clustered on the Y-axis (A-5 G) and anti-glycolipid antibodies were clustered on the X-axis. The clusters are separated by white 6 lines. Each patient cluster is characterised by a distinct antibody reactivity pattern (A: broad-7 ranging GalNAc-GD1a reactivity, B: restricted GA1 and broad-ranging GM1 reactivity, C: 8 restricted GalNAc-GD1a reactivity, D: restricted GA1, GD1b, and GM1 reactivity, E: nonspecific, F: restricted GQ1b and GT1a reactivity, and G: broad-ranging GT1a reactivity). GN-GD1a: N-9 acetylgalactosaminyl GD1a, Sulph: sulphatide, SGPG: sulphated glucuronyl paragloboside, PS: 10 11 phosphatidylserine, GalC: galactocerebroside.

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Figure 4 Dot plots and stacked bar plots illustrating the associations between anti-glycolipid 13 14 antibodies (reactivity patterns) and electrophysiological subtypes in Guillain-Barré syndrome. (A) Box plots with individual anti-GM1 (left) and anti-GM1:Sulphatide (right) 15 16 fluorescence intensities across electrophysiological subtypes. (B) Stacked bar plot depicting the distribution of electrophysiological subtypes across patient clusters based on anti-glycolipid 17 antibody reactivity patterns. (C) Dot plot illustrating the interaction of GM1 with GD1a in patients, 18 by comparing the sum of fluorescence intensities of anti-GM1 and anti-GD1a (anti-GM1 + anti-19 20 GD1a) with the fluorescence intensity of the anti-complex antibody anti-GM1:GD1a per 21 individual patient. Each line connects the fluorescence intensity of anti-GM1 + anti-GD1a to the 22 fluorescence intensity of anti-GM1:GD1a of one patient. Groups are based on electrophysiological subtypes. (D) Stacked bar plot showing the distribution of electrophysiological subtypes across 23 three groups based on the interaction of GM1 with GD1a (complex independent, enhanced or 24 attenuated). \* p < 0.05, \*\* p < 0.01, \*\*\* p < 0.001. FI: fluorescence intensity, U: units, Sulph: 25 sulphatide. 26

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Figure 5 Cumulative incidence curves for the time to regain the ability to walk unaided in relation to anti-glycolipid antibody reactivity. Cumulative incidence curves are shown for IgG anti-GQ1b:GM4 (A), IgG anti-GM1:Sulphatide (B), IgA anti-GM1:Sulphatide (C), and patient

1 clusters based on anti-glycolipid antibody reactivity patterns (D). Pos.: positive, Neg.: negative,

2 Sulph: sulphatide.











GBS vs c	ontrols	Motor GBS	vs controls	MFS vs controls		
Top five AGAb	OR (95% CI)	Top five AGAb	OR (95% CI)	Top five AGAb	OR (95% CI)	
Anti-GAI:Sulph	2.01 (1.85–2.20)	Anti–GAI:Sulph	2.34 (2.11–2.60)	Anti–GQ1b:SGPG	3.32 (2.79–4.00)	
Anti-GA1:PS	1.83 (1.68–2.00)	Anti–GA1:PS	2.26 (2.05–2.52)	Anti–GQ1b:LM1	6.63 (5.01-9.04)	
Anti-GAI :GalC	2.10 (1.89–2.35)	Anti–GM1:SGPG	2.94 (2.52–3.45)	Anti–GQ I b:Sulph	4.49 (3.58–5.79)	
Anti-GM I :Sulph	3.90 (3.19–4.87)	Anti–GM I :Sulph	4.30 (3.47–5.45)	Anti–GQ1b:GalC	5.05 (3.93-6.78)	
Anti-GD1b:Sulph	4.25 (3.41–5.45)	Anti–GAI:GalC	2.21 (1.96–2.52)	Anti–GQ1b:GD1b	7.19 (5.25–10.18)	

All described anti-glycolipid antibodies are of the IgG isotype. Ranking of anti-glycolipid antibodies was based on P in univariable logistic regression analyses on the complete dataset. GBS = Guillain-Barré syndrome; MFS = Miller Fisher syndrome; AGAb = anti-glycolipid antibodies; OR = odds ratio; CI = confidence interval; Sulph = sulphatide; PS = phosphatidylserine; GalC = galactocerebroside; SGPG = sulphated glucuronyl paragloboside.

Table 2 Model performance statistics for models distinguishing Guillain-Ba	arré syndrome, motor Guillain-Barré syndrome, or
Miller Fisher syndrome from controls	

Group	Model	Constituent IgG anti-glycolipid antibodies	C-statistic	R <sup>2</sup>
GBS	Current	GMI, GDIa, GDIb, GQIb	0.76 (0.74–0.78)	0.27 (0.22-0.32)
	New	GD1b, GQ1b, SGPG, GM1:GD1a, GA1:LM1, GA1:Sulph, GalC:LM1	0.89 (0.88–0.91)	0.56 (0.52–0.61)
Motor GBS	Current	GMI	0.74 (0.71–0.78)	0.30 (0.23–0.37)
	New	GM1:GD1a, GA1:Sulph	0.87 (0.84–0.90)	0.52 (0.45-0.59)
MFS	Current	GQIb	0.76 (0.70-0.80)	0.30 (0.21–0.39)
	New	GQ1b:GA1, GQ1b:GalC	0.91 (0.87-0.95)	0.64 (0.56–0.73)

Analyses were performed in the complete dataset. Data are presented as value (95% confidence interval). The C-statistic and R<sup>2</sup> were optimismcorrected. GBS = Guillain-Barré syndrome; SGPG = sulphated glucuronyl paragloboside; Sulph = sulphatide; GalC = galactocerebroside; MFS = Miller Fisher syndrome.

15 16 Table 3 Clinical features of patient clusters derived from unsupervised hierarchical clustering of anti-glycolipid antibody fluorescence intensities in patients with Guillain-Barré syndrome

Variable	Cluster A	Cluster B	Cluster C	Cluster D	Cluster E	Cluster F	Cluster G	
	GalNAC-	GMI (b).	GalNAc-	GMI. GAI.	Non-specific	GOIb.	GTIa(b)	
	GD1a (b)	GAI (r)	GDIa (r)	GD lb (r)	· · · · · · · · · · · · · · · · · · ·	GTIa (r)	0110(2)	
Geographical region		/						
Europe	21 (55.3)	19 (44.2)	9 (50.0)	33 (66.0) <sup>g</sup>	713 (61.7) <sup>g</sup>	34 (48.6)	12 (30.8)	
Americas	5 (13.2)	7 (16.3)	l (5.6)	4 (8.0)	193 (16.7)	21 (30.0) <sup>d,e</sup>	13 (33.3) <sup>d</sup>	
Africa	2 (5.3)	0 (0)	0 (0)	2 (4.0)	20 (1.7)	I (I.4)	5 (12.8) <sup>e</sup>	
Asia without	3 (7.9)	3 (7.0)	2 (11.1)	4 (8.0)	75 (6.5)	l 4 (20.0) <sup>e</sup>	3 (7.7)	
Bangladesh								
Bangladesh	7 (18.4)	14 (32.6) <sup>e</sup>	6 (33.3)	7 (14.0)	154 (13.3)	0 (0)	6 (15.4)	
Clinical variant								
Motorsensory	14 (36.8)	22 (51.2) <sup>f</sup>	2 (11.1)	19 (38.0)	738 (63.9) <sup>a,c,d,f,g</sup>	12 (17.1)	9 (23.1)	
Motor	24 (63.2) <sup>e</sup>	18 (41.9) <sup>e</sup>	15 (83.3) <sup>b,e</sup>	25 (50.0) <sup>e</sup>	212 (18.4)	0 (0)	17 (43.6) <sup>e</sup>	
Miller Fisher syndrome <sup>h</sup>	0 (0)	2 (4.7)	l (5.6)	2 (4.0)	85 (7.4)	53 (75.7) <sup>b,c,d,e,g</sup>	10 (25.6) <sup>e</sup>	
Preceding infection	Preceding infection							
Campylobacter jejuni	34/38	26	(6 . ) <sup>e,f</sup>	20 (40.0)	295/1153	18 (25.7)	29	
	(89.5) <sup>b,d,e,f</sup>	(60.5) <sup>e,t</sup>			(25.6)		(74.4) <sup>d,e,t</sup>	
Mycoplasma pneumoniae	4/38 (10.5)	6 (14.0)	l (5.6)	6 (12.0)	(9.6)	5 (7.1)	8 (20.5)	
Cytomegalovirus	0 (0)	0 (0)	0 (0)	0 (0)	53/1150(4.6)	I (I.4)	0 (0)	
Hepatitis E virus	0 (0)	0 (0)	0 (0)	2 (4.0)	29/1153(2.5)	0 (0)	l (2.6)	
Epstein-Barr virus	1/37 (2.6)	0 (0)	0 (0)	0 (0)	10/1151(0.9)	0 (0)	I (2.6)	

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Cranial nerve palsy at study entry								
Facial	2 (5.3)	4 (9.3)	5 (27.8)	10 (20.0)	350/1143 (30.6) <sup>a,b</sup>	19 (27.1)	8 (20.5)	
Bulbar	2 (5.3)	6 (14.0)	3 (16.7)	7 (14.0)	275/1143 (24.1)	28 (40.0) <sup>a,b,d,e</sup>	16 (41.0) <sup>a,d</sup>	
Oculomotor	0 (0)	5 (11.6)	l (5.6)	6 (12.0)	115/1143 (10.1)	55 (78.6) <sup>b,c,d,e,g</sup>	14 (35.9) <sup>e</sup>	
Electrophysiological	subtype							
Normal	0 (0)	1/28 (3.6)	0 (0)	0 (0)	41/749 (5.5)	16/53 (30.2) <sup>e</sup>	1/20 (5.0)	
Demyelinating	17/32 (53.1) <sup>f</sup>	8/28 (28.6)	6/17 (35.3)	30/46 (65.2) <sup>b,f</sup>	452/749 (60.3) <sup>b,f</sup>	10/53 (18.9)	13/20 (65.0) <sup>f</sup>	
Axonal	9/32 (28.1) <sup>e,f</sup>	/28 (39.3) <sup>e,f</sup>	3/17 (17.6)	7/46 (15.2)	59/749 (7.9)	2/53 (3.8)	1/20 (5.0)	
Inexcitable	2/32 (6.3)	2/28 (7.1)	2/17 (11.8)	1/46 (2.2)	22/749 (2.9)	0 (0)	1/20 (5.0)	
Equivocal	4/32 (12.5)	6/28 (21.4)	6/17 (35.3)	8/46 (17.4)	175/749 (23.4)	25/53 (47.2) <sup>a,d,e</sup>	4/20 (20.0)	
Disease course	Disease course							
Mechanical ventilation	I (2.6)	6 (14.0)	4 (22.2)	9 (18.0)	210 (18.2)	9 (12.9)	7 (17.9)	
Disability score ≥3 at nadir	29/37 (78.4)	33/38 (86.8)	15 (83.3)	39/49 (79.6)	871/1095 (79.5)	48/67 (71.6)	36/38 (94.7)	
Disability score ≥3 at 26 weeks	10/35 (28.6) <sup>f</sup>	12/34 (35.3) <sup>f</sup>	3/16 (18.8)	10/40 (25.0)	161/894 (18.0)	2/52 (3.8)	6/33 (18.2)	

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Data are presented as count (%). Each cluster was compared to other clusters in logistic regression analyses. Significant differences between two clusters are indicated (bolded) for one of two clusters. Data to which logistic regression analyses were not applicable (due to all patients being in the same group) are presented in italics. GalNAc-GD1a=N-acetylgalactosaminyl GD1a; (b)=broad-ranging reactivity; (r)=restricted reactivity. <sup>arg</sup>Differs from cluster A, B, C, D, E, F, or G, respectively. <sup>h</sup>Including overlap with Guillain-Barré syndrome.