### **Global variability of the human IgG glycome**

Jerko Štambuk<sup>1</sup>, Natali Nakić<sup>2</sup>, Frano Vučković<sup>1</sup>, Maja Pučić-Baković<sup>1</sup>, Genadij Razdorov<sup>1</sup>, Irena Trbojević-Akmačić<sup>1</sup>, Mislav Novokmet<sup>1</sup>, Toma Keser<sup>3</sup>, Marija Vilaj<sup>1</sup>, Tamara Štambuk<sup>3</sup>, Ivan Gudelj<sup>1</sup>, Mirna Šimurina<sup>3</sup>, Manshu Song<sup>4,5</sup>, Hao Wang<sup>4,5</sup>, Marijana Peričić Salihović<sup>6</sup>, Harry Campbell<sup>7</sup>, Igor Rudan<sup>7</sup>, Ivana Kolčić<sup>8</sup>, Leigh Anne Eller<sup>9,10</sup>, Paul McKeigue<sup>7</sup>, Merlin L. Robb<sup>9,10</sup>, Jonas Halfvarson<sup>11</sup>, Metin Kurtoglu<sup>12</sup>, Vito Annese<sup>13</sup>, Tatjana Škarić-Jurić<sup>6</sup>, Mariam Molokhia<sup>14</sup>, Ozren Polašek<sup>8</sup>, Caroline Hayward<sup>15</sup>, Hannah Kibuuka<sup>16</sup>, Kujtim Thaqi<sup>17</sup>, Dragan Primorac<sup>18</sup>, Christian Gieger<sup>19</sup>, Sorachai Nitayaphan<sup>20</sup>, Tim Spector<sup>21</sup>, Youxin Wang<sup>4,5</sup>, Therese Tillin<sup>22</sup>, Nish Chaturvedi<sup>22</sup>, James F. Wilson<sup>7,15</sup>, Moses Schanfield<sup>23</sup>, Maxim Filipenko<sup>24</sup>, Wei Wang<sup>4,5</sup>, Gordan Lauc<sup>1,3</sup>

<sup>1</sup>Genos Glycoscience Research Laboratory, Zagreb, Croatia

<sup>2</sup>Department of Neuroscience, Scuola Internazionale Superiore di Studi Avanzati (SISSA), Trieste, Italy

<sup>3</sup>Faculty of Pharmacy and Biochemistry, University of Zagreb, Zagreb, Croatia

<sup>4</sup>Beijing Key Laboratory of Clinical Epidemiology, School of Public Health, Capital Medical University, Beijing, China

<sup>5</sup>School of Medical and Health Sciences, Edith Cowan University, Perth, Australia

<sup>6</sup>Institute for Anthropological Research, Zagreb, Croatia

<sup>7</sup>Centre for Global Health Research, Usher Institute of Population Health Sciences and Informatics, The University of Edinburgh, Edinburgh, United Kingdom

<sup>8</sup>School of Medicine, University of Split, Split, Croatia

<sup>9</sup>Walter Reed Army Institute of Research, Silver Spring, MD 20910, USA

<sup>10</sup>Henry M. Jackson Foundation for the Advancement of Military Medicine, Bethesda, MD 20817, USA

<sup>11</sup>Department of Gastroenterology, Faculty of Medicine and Health, Örebro University, Örebro, Sweden

<sup>12</sup>Department of Oncology, Koç University School of Medicine, Istanbul, Turkey

<sup>13</sup>Careggi University Hospital, Florence, Italy

<sup>14</sup>School of Population Health and Environmental Sciences, King's College London, London, United Kingdom <sup>15</sup>MRC Human Genetics Unit, MRC Institute for Genetics and Molecular Medicine, University of Edinburgh, Edinburgh, United Kingdom

<sup>16</sup>Makerere University Walter Reed Project, Kampala, Uganda

<sup>17</sup>Institute of Clinical Biochemistry, Priština, Kosovo

<sup>18</sup>St. Catherine Hospital, Zagreb, Croatia

<sup>19</sup>Helmholtz Zentrum München - German Research Center for Environmental Health, Neuherberg, Germany
<sup>20</sup>Armed Forces Research Institute of Medical Sciences, Bangkok, Thailand

<sup>21</sup>Department of Twin Research and Genetic Epidemiology, King's College London, London, United Kingdom

<sup>22</sup>Institute of Cardiovascular Science, Faculty of Population Health Sciences, London, United Kingdom

<sup>23</sup>Department of Forensic Sciences, George Washington University, Washington, DC 20007, USA

<sup>24</sup>Institute of Chemical Biology and Fundamental Medicine, Novosibirsk, Russia

Correspondence to: Gordan Lauc; email: glauc@pharma.hr

Keywords: glycans, aging, immunoglobulin G, Fc glycosylation, mass spectrometryReceived: May 26, 2020Accepted: July 25, 2020Published: August 12, 2020

**Copyright:** Štambuk et al. This is an open-access article distributed under the terms of the Creative Commons Attribution License (CC BY 3.0), which permits unrestricted use, distribution, and reproduction in any medium, provided the original author and source are credited.

#### ABSTRACT

Immunoglobulin G (IgG) is the most abundant serum antibody which structural characteristics and effector functions are modulated through the attachment of various sugar moieties called glycans. Composition of the IgG N-glycome changes with age of an individual and in different diseases. Variability of IgG glycosylation within a population is well studied and is known to be affected by both genetic and environmental factors. However, global inter-population differences in IgG glycosylation have never been properly addressed. Here we present population-specific N-glycosylation patterns of IgG, analyzed in 5 different populations totaling 10,482 IgG glycomes, and of IgG's fragment crystallizable region (Fc), analyzed in 2,579 samples from 27 populations sampled across the world. Country of residence associated with many N-glycan features and the strongest association was with monogalactosylation where it explained 38% of variability. IgG monogalactosylation strongly correlated with the development level of a country, defined by United Nations health and socioeconomic development indicators, and with the expected lifespan. Subjects from developing countries had low levels of IgG galactosylation, characteristic for inflammation and ageing. Our results suggest that citizens of developing countries may be exposed to environmental factors that can cause low-grade chronic inflammation and the apparent increase in biological age.

#### **INTRODUCTION**

Immunoglobulin G is the most common antibody class circulating in human blood [1]. It mediates interactions between antigens and the immune system [2]. There are four IgG subclasses present in plasma, which differ in the constant region of the molecule: IgG1, IgG2, IgG3 and IgG4 [3]. Each subclass has distinctive features and functions, such as pronounced affinity for certain types of antigens, formation of immune complexes, complement activation, interactions with effector cells, half-life and placental transport [2]. Every IgG molecule contains covalently attached N-linked glycans which are essential for some of its functions [4].

Glycosylation is a coand post-translational modification which is orchestrated by a complex biosynthetic pathway [5]. IgG contains a conserved Nglycosylation site on Asn<sup>297</sup> residue within its fragment crystallizable (Fc) region, on each of the two identical heavy chains [6]. Glycans attached to IgG are mainly of a complex biantennary type, with the core structure consisting of four N-acetylglucosamines (GlcNAc) and three mannoses. Different glycan moieties such as bisecting GlcNAc, galactose, sialic acid and fucose can be attached to this core [4]. IgG shows a high degree of diversity in glycosylation, with each of the four IgG subclasses displaying a distinctive glycome composition [7]. Also, each of the heavy chains of the same molecule can carry different glycans, creating a large repertoire of possible IgG glycoforms [8]. Finally, in 15-20% of cases, an additional N-glycosylation site appears within variable region of antigen-binding fragment (Fab), as a result of somatic hypermutation events during affinity maturation [9].

Many IgG functions are achieved through interactions with receptors on immune cells and complement

proteins. Fc glycans affect immunoglobulin conformation, which, in turn, defines binding affinity for Fc gamma receptors (FcyRs) on effector cells and complement, leading to alterations in effector functions [1, 10, 11]. Furthermore, IgG galactosylation level has an extensive effect on its inflammatory potential [12]. Namely, agalactosylated IgG has increased inflammatory potential through activation of alternative complement pathway, while on the other hand, high level of galactose is necessary for activation of anti-inflammatory cascade through interactions with FcyRIIB and inhibition of the inflammatory activity of C5a complement component [13-16]. However, there are also reports suggesting proinflammatory action of highly galactosylated IgG. Terminal IgG galactosylation is required for increased binding to activating Fc gamma receptors and therefore activation of antibody-dependent cellular cytotoxicity (ADCC) [17]. Also, terminal galactoses are necessary for Clq complement component binding and activation of complement-dependent cytotoxicity (CDC) [18]. Attachment of other sugar moieties affects antibody properties as well. Namely, presence of fucose attached to the first N-acetylglucosamine, i.e. core fucose, decreases ADCC activity, while the presence of bisecting GlcNAc increases binding affinity for activating Fcy receptors [19]. Terminal sialic acids appear to contribute to enhanced anti-inflammatory activity of intravenous immunoglobulin (IVIg) [20]. Although a subject to debate, proposed mechanisms include reduced affinity of sialylated IgG for activating FcyRs, and increased recognition by lectin receptors and complement component C1q [21, 22].

There is a prominent inter-individual variability of the total IgG N-glycome, which is under strong influence of numerous genes and environmental factors [23]. Average IgG glycome heritability is estimated to approximately 50%, while the remaining variability can be mostly

attributed to environmental factors [23–25]. Prominent changes in the IgG N-glycome composition were found in several diseases. In different autoimmune and alloimmune disorders, cancers and infectious diseases, changes in IgG glycosylation reflect the increased inflammation which usually accompanies these conditions [12]. The impact of IgG glycosylation on its ability to modulate inflammation has been extensively studied as a potential biomarker for disease prognosis and treatment response, as well as for monoclonal antibody development [26, 27].

The composition of IgG N-glycome is also strongly influenced by sex hormones, age, and lifestyle such as smoking and body mass index [12, 28, 29]. Functional relevance of the impact of sex hormones on IgG glycosylation is notable through pregnancy-related remission in rheumatoid arthritis patients. Namely, the third trimester of pregnancy is characterized by antiinflammatory IgG glycan profile and disease remission, due to high estradiol levels, while in post-partum period hormone levels decrease and IgG glycan profile changes back to pro-inflammatory, with a high risk of disease resurgence [30]. Since estrogen levels change during lifetime in women, sex-specific changes in glycosylation patterns can be observed, especially in levels of IgG galactosylation [31].

Ageing is a process of damage aggregation in an organism, characterized by increase of inflammation and decline in health, leading to disease and death [32]. It is influenced by both genetic factors and environment. Complex changes in IgG N-glycome have been reported during ageing, with the most extensive changes being related to the level of galactosylation. Namely, digalactosylated structures decrease, while agalactosylation increases with age [28]. Level of bisecting GlcNAc also increases with age, while changes in level of sialylation and core fucosylation displayed inconsistent trends in different studies [28]. IgG glycans have been shown to be more reliable estimators of age compared to other biomarkers, explaining up to 64% of the variation in chronological age [12]. Mechanisms underlying age-specific changes in galactosylation levels remain mostly unknown. Since ageing is an inflammation-related process, it has been proposed that chronic low-grade inflammation in older individuals decreases IgG galactosylation. On the other hand, undergalactosylated IgG exerts pro-inflammatory potential and by this positive feedback loop contributes to biological ageing [33, 34].

Despite the fact that structural and functional aspects of IgG glycosylation are intensively studied and associated with predisposition and course of different diseases, little is known about the regulation of IgG glycosylation or mechanisms that lead to extensive changes in glycome composition after environmental challenge [12, 35, 36]. Therefore, the focus of this study was to analyze and compare IgG N-glycosylation patterns in various populations and communities across the world, marked by their different genetic background and socioeconomic factors.

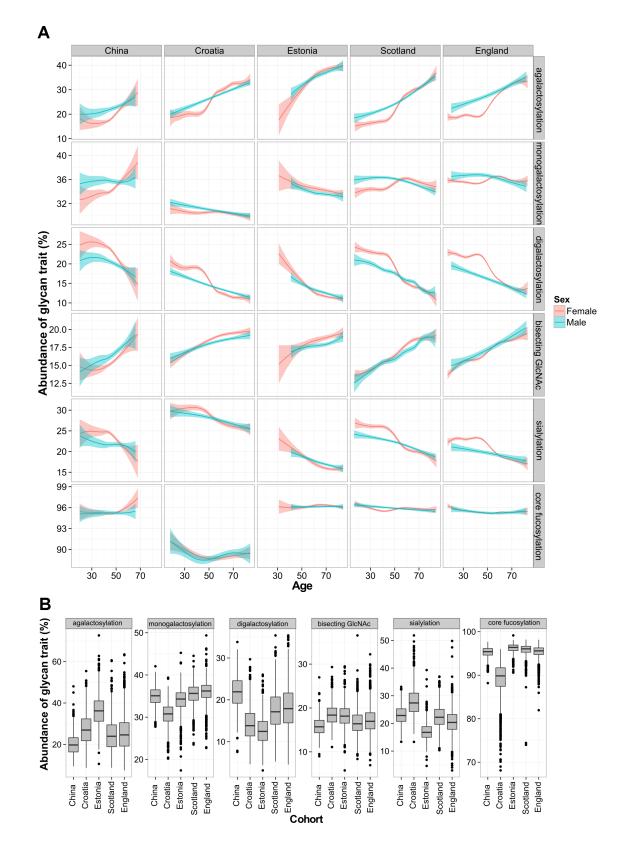
#### RESULTS

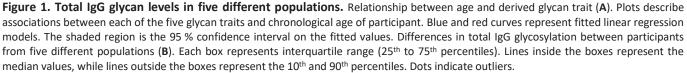
In this study, we analyzed total IgG glycans and subclass specific Fc glycopeptides from various countries and communities. In both cases we observed significant changes in IgG glycosylation associated with age, sex and country of residence, where age and country of residence were able to explain a significant portion of glycosylation variability. IgG glycans also strongly correlated with the development level of a country and with specific development indicators as well.

# Total IgG glycans change with chronological age and sex

In the initial analysis, samples originating from 10,482 individuals and 5 different general populations (Supplementary Table 1) were analyzed. Fluorescently labelled N-glycans released from IgG were chromatographically profiled and separated into 24 chromatographic peaks (Supplementary Figure 1, Supplementary Table 2). This approach enables analysis of total IgG N-glycans (i.e., from both Fab and Fc parts of the molecule). Additionally, derived glycan traits (agalactosylation, monogalactosylation, digalactosylation, core fucosylation, sialylation and presence of bisecting GlcNAc) were calculated, based on the initial 24 glycan measures (calculation of derived glycan traits can be found in Supplementary Table 3) [23]. In general, agalactosylation levels showed the highest dispersion of all tested glycan traits (Q1=20%, Q3=32%; Supplementary Table 4), which coincides with the previous studies.

It is known that the chronological age of a subject affects IgG glycosylation [28]. Age-related changes were observed in the levels of various IgG glycan traits in all studied populations. Agalactosylated species and glycans containing bisecting GlcNAc increased with the chronological age of the participant. The opposite trend was observed in the levels of digalactosylated and sialylated glycans, which were decreasing with chronological age. On the other hand, core fucosylation and monogalactosylation levels did not change consistently with age. Furthermore, age-related changes in glycosylation displayed sex-specific patterns. Namely, female participants displayed characteristic increase in agalactosylated glycan species at the age of 50, which was not observed in the male population (Figure 1A).





# Age and country of residence explain most of variability in IgG glycosylation

Although total IgG N-glycans showed similar agerelated changes within each of the studied cohorts, every population displayed particular glycan patterns. Again, the most pronounced differences between populations were observed in the levels of agalactosylated glycans, which increased with a median age of the analyzed population (Figure 1B). This glycan trait had the lowest median value in young Chinese cohort (20%), while the highest value was observed in Estonian cohort (36%), which was the oldest. Besides agalactosylation, pronounced differences between populations were also observed in the levels of digalactosylated and sialylated glycans (Supplementary Table 4). A linear mixed model was used to further elucidate changes in IgG glycan traits in different populations. Relations of age, country of residence and sex with the total IgG glycans were evaluated. Chronological age was able to moderately explain variability of total IgG glycan traits - for digalactosylation and agalactosylation it explained up to 31% of their variability. Contrary to age, participant's country of residence was able to explain larger portion of variability of core fucose levels  $(P \le 6 \times 10^{-350}, n = 5)$ , with 57 % of the variability in this glycan trait explained. It was also able to account for the portion of monogalactosylation and sialylation variability. On the other hand, sex was able to explain less than 1% of the variability of any tested glycan trait (Supplementary Table 5).

# Fragment crystallizable glycan patterns of 27 different populations

To validate observed diversity and unambiguously determine IgG N-glycosylation patterns in different populations (Supplementary Table 6), while eliminating potential batch effects, we compared glycan features derived from IgG subclass-specific Fc glycopeptides from 2,579 individuals (Supplementary Table 7, Supplementary Figure 2). This part of the study included 27 populations collected in 14 different countries. Subclass-specific glycopeptides were chromatographically separated and accurate masses were measured for each glycoform. Structures of IgG glycopeptides were confirmed using tandem mass spectrometry (MS/MS) analysis of a pooled sample (Supplementary Figures 3-5). Calculated IgG Fc Nglycan derived traits displayed considerable dispersion between analyzed populations (Figure 2). The Fc Nglycome composition is known to differ from the total IgG N-glycome, as a result of Fab N-glycome contribution to the total IgG glycome [37]. Again, the most prominent variation appeared to be in the level of

galactosylation related traits, especially agalactosylation (Supplementary Tables 7-9). On the other hand, expected decrease in digalactosylation levels with the population's age was not observed. On the contrary, some populations appeared to have lower than expected monogalactosylation and digalactosylation levels for the given chronological age. Population from Papua New Guinea, as the youngest one, surprisingly had the highest median level of agalactosylation (45 %), while the subjects from England exhibited the lowest levels of this glycan trait (28%) on IgG1 subclass. The opposite effect was observed for monogalactosylation levels - the subjects from Papua New Guinea had the lowest median value of this glycan trait, while the highest levels were observed for the participants from England. In a similar manner, participants from countries such as Germany and Italy had higher monogalactosylation levels (comparable to subjects from England) than the ones from countries such as Uganda (similar to subjects from Papua New Guinea; Supplementary Table 7).

In the case of IgG2 and IgG4 subclasses, galactosylation related glycan traits displayed similar variation as for IgG1 subclass, although the observed glycosylation patterns appeared to be somewhat subclass-specific, especially in case of IgG4, which is the least abundant subclass in the human plasma (Supplementary Tables 8 and 9).

# Age and country of residence can explain IgG Fc glycosylation variability

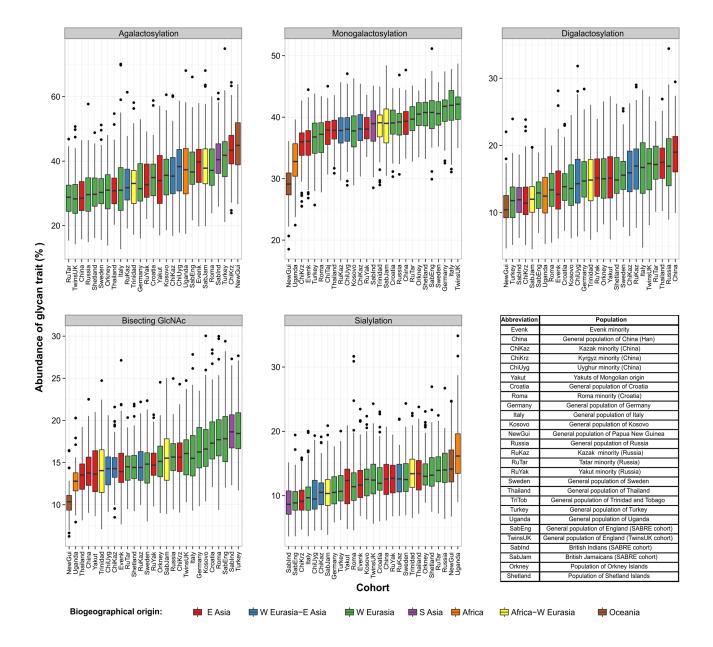
To determine the relationship between IgG Fc glycan traits and sex, chronological age and country of residence, linear mixed model was used. The same as in the case of total IgG glycans, chronological age was able explain а considerable to portion of agalactosylation and digalactosylation variability. It was able to explain 28% of IgG2 agalactosylation variability compared to 22 % for IgG1 subclass. Country of residence was able to explain the highest portion of IgG Fc monogalactosylation variability 38 % (Table 1). Namely, of IgG1 Fc monogalactosylation variability could be explained with the subject's country of residence. Here as well, sex was able to explain up to 1% of the IgG Fc glycan variability. Glycan patterns similar to IgG1 subclass were observed for IgG2 and IgG4.

# IgG Fc galactosylation features correlate with the development level of a country

In order to resolve relations between country of residence and studied IgG Fc glycan traits, we analyzed correlations between 45 development indicators and 5 derived glycan traits of each analyzed IgG subclass

(Supplementary Table 10). Development indicators are standardized statistical measures which quantify the quality of life across nations and communities (Supplementary Tables 11 and 12). Our analysis resulted with 44 statistically significant correlations of IgG Fc monogalactosylation, digalactosylation and agalactosylation with 23 different development indicators. The strongest correlation was observed between IgG1 monogalactosylation and Millennium Development Goals (MDG), Human Development Index (HDI) and stunting. On the other hand, we did not observe any significant correlations between any of the development indicators and sialylation or the incidence of bisecting GlcNAc on any of the IgG subclasses.

We found a positive correlation between United Nation's Human development index (HDI) and IgG1 Fc monogalactosylation, while HDI negatively correlated with IgG1 agalactosylation (Figure 3). These findings were replicated for IgG2 subclass as well, where HDI positively correlated with monogalactosylation levels. Therefore, participants from developing countries appear to have lower levels of IgG Fc monogalactosylation and digalactosylation when compared to their counterparts from developed countries.

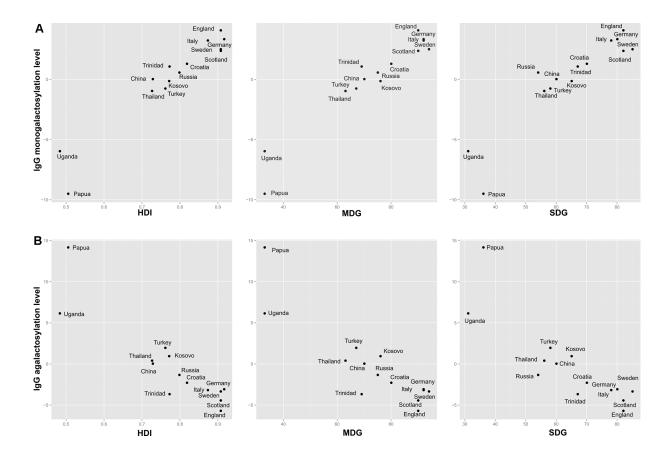


**Figure 2. Levels of derived IgG1 Fc glycan traits across 27 different populations collected worldwide.** Each box represents interquartile range (25<sup>th</sup> to 75<sup>th</sup> percentiles) with median values drawn as the middle line. Whiskers outside the boxes represent the 10<sup>th</sup> and 90<sup>th</sup> percentiles, while dots indicate outliers.

IgG subclass	Glycan feature	Percentage of glycan trait variability explained by country of residence (%)	Percentage of glycan trait variability explained by age (%)	Percentage of glycan trait variability explained by sex (%)	Country of residence <i>P</i> value
	Agalactosylation	21.4	18.3	0.9	$1.03 \times 10^{-111}$
	Monogalactosylation	38.0	2.6	0.1	$7.69 \times 10^{-193}$
IgG1	Digalactosylation	18.6	21.7	1.1	$3.51 \times 10^{-98}$
•	Sialylation	10.8	13.2	0.6	$1.27 \times 10^{-54}$
	<b>Bisecting GlcNAc</b>	18.6	17.5	0.0	$9.28 \times 10^{-110}$
	Agalactosylation	12.8	23.9	0.9	$7.18 \times 10^{-62}$
	Monogalactosylation	20.8	7.6	0.1	$3.34 \times 10^{-94}$
IgG2	Digalactosylation	10.4	27.5	1.1	$2.70 \times 10^{-54}$
•	Sialylation	6.5	18.2	0.5	$1.22 \times 10^{-27}$
	Bisecting GlcNAc	12.4	11.9	0.1	$3.66 \times 10^{-64}$
	Agalactosylation	20.5	13.7	0.4	$1.32 \times 10^{-93}$
	Monogalactosylation	20.8	2.6	0.1	$1.30 \times 10^{-78}$
IgG4	Digalactosylation	18.2	14.1	0.8	$1.28 \times 10^{-86}$
-	Sialylation	15.4	9.7	0.5	$6.44 \times 10^{-75}$
	Bisecting GlcNAc	7.6	15.7	0.6	$2.01 \times 10^{-37}$

Table 1. Proportion of glycan feature variability in 14 countries explained by linear mixed model, with age and sex defined as fixed effects and country of residence as a random effect.

Displayed values represent percentage (%) of glycan trait variability explained by country, age and sex.



**Figure 3. Relationship between IgG1 Fc galactosylation levels with development indices.** Relationship between IgG1 Fc monogalactosylation (**A**) and relationship between IgG1 Fc agalactosylation (**B**) with United Nations' development indices for a specific country of residence. HDI = Human Development Index; SDG = health-related Sustainable Development Goals index; MDG = health-related Millennium Development Goals index.

# IgG Fc monogalactosylation correlates with population's health status

To determine the relationship between health quality and IgG glycans, correlations between the two were calculated. Population's health quality was expressed through general health indices (HDI, SDG, MDG) and specific health indicators such as stunting, mortality and life expectancy. Countries with lower development level, in general, had also lower health-related indicators (Supplementary Table 13). The majority of health-related indicators appeared to be correlated with IgG Fc monogalactosylation (Supplementary Table 10). Millennium Development Goals (MDG) index, which describes health-related indicators in MDG system, was and positively correlated with IgG1 IgG2 monogalactosylation (r=0.97,  $P=7.44\times10^{-6}$  and r=0.86,  $P=4.59\times10^{-2}$  respectively) and negatively correlated with IgG1 agalactosylation (r=-0.90,  $P=8.16\times10^{-3}$ ). In a similar fashion, a positive correlation was observed between IgG1 monogalactosylation and Sustainable Development Goals (SDG) index, non-MDG index (health-related SDG indicators not included in MDG) and Health index, which, like MDG index, display overall health quality of a specific country. SDG index negatively correlated was also with IgG1 agalactosylation (Supplementary Table 10, Figure 3).

Besides general health-related indices, specific healthrelated indicators also correlated with IgG Fc monogalactosylation agalactosylation, and digalactosylation. Among all studied specific indicators, the decline in stunted growth prevalence demonstrated the strongest positive correlation with IgG1 monogalactosylation (r=0.97,  $P=1.16\times10^{-5}$ ; n=14). Among other studied indicators, universal health coverage and the decrease in occupational risk burden displayed substantial correlations with IgG Fc agalactosylation and monogalactosylation levels. Life expectancy is also one of the most important indicators, used to describe life quality. Both female and male life correlated expectancies were with IgG Fc monogalactosylation. Individual's exposure to various antigens was presented through indicators such as hygiene, water availability, WaSH mortality and sanitation, which also showed significant correlations with IgG Fc galactosylation levels. Of the various infectious diseases, only hepatitis B showed a significant correlation with IgG Fc monogalactosylation (Supplementary Table 10).

Moreover, digalactosylation of IgG1 demonstrated five positive correlations with health-related development indicators, where skilled birth attendance and again, stunted growth, had the strongest associations with this glycan trait (Supplementary Table 10). Although IgG1 Fc glycans showed the strongest correlation with the health-related indicators, significant correlations between IgG1 Fc galactosylation related glycan features and the socioeconomic indicators, such as education and economic development, have also been identified. Education index was significantly correlated with both Fc monogalactosylation (r=0.94,  $P=5.14\times10^{-4}$ , n=14) and agalactosylation (r=-0.90,  $P=1.02\times10^{-2}$ , n=14), while Gross Domestic Product (GDP) was significantly correlated only with monogalactosylation (r=0.89,  $P=1.46\times10^{-2}$ , n=14; Supplementary Table 10). Correlation analysis between development indicators used in this study displayed high dependencies between used variables (Supplementary Table 14).

#### **DISCUSSION**

This is the largest study to date that has analyzed IgG glycosylation in various populations, encompassing 10,482 of total IgG N-glycomes originating from 5 different populations and 2,579 Fc IgG glycopeptide profiles of subjects from 27 populations. As suggested by previously published data, we observed considerable variation of IgG N-glycan profiles between individuals within the same population, as well as between different populations [23, 38].

Within five populations, where glycans from the whole IgG molecule were analyzed, we observed changes in glycan patterns depending on age and sex. Sex-specific changes are thought to be caused by differences in hormone composition between sexes, especially estrogen that can vary due to pregnancy, menopause or hormonal therapy [23]. This is clearly visible in female N- glycan profiles, where around the age of 50, a decrease of galactosylated IgG glycoforms can be detected. This decrease in galactosylation is associated with alterations and finally decrease of estrogen levels during menopausal transition and post-menopause [39]. Despite the fact that the exact mechanism remains unknown, it has been proposed that high levels of estrogen and progesterone decrease inflammation through reduced production of inflammatory cytokines and induction of helper T lymphocytes [40].

IgG glycosylation is also known to change with chronological and biological age of an individual [28]. We observed an expected decrease in levels of digalactosylation and increase in bisecting GlcNAc levels with the age of participant. Age-related decline in IgG galactosylation is associated with the increase in systemic low-grade inflammation which can be observed in older people [28, 41]. This increase in inflammation is usually explained by higher levels of pro-inflammatory cytokines, such as tumor necrosis factor- $\alpha$  and interleukin-6, found in aged individuals [42]. In

accordance, decreased galactosylation also enhances the pro-inflammatory potential of IgG. The decrease in IgG galactosylation has also been observed in premature ageing syndromes, which are also accompanied by inflammation, as in numerous inflammatory and autoimmune diseases, such as inflammatory bowel disease (IBD), rheumatoid arthritis and systemic lupus erythematosus [26, 36, 41, 43]. Although exact mechanisms underlying age-related changes in IgG glycan profile remain unknown, there are several proposed pathways which could explain them. Possible mechanisms include various expression or activity of enzymes involved in glycosylation processes in B-cells and clonal selection of B-cells with specific glycosylation patterns [44, 45]. Therefore, through modulation of inflammation, IgG galactosylation, or more precisely agalactosylation, is proposed to contribute to a process of biological ageing [46].

We have demonstrated differences in glycan profiles between analyzed populations with both analytical approaches - with total IgG N-glycans and Fc glycopeptides, which suggests population-specificity of IgG glycosylation. The highest differences in Fc glycopeptides between analyzed countries were observed in their galactosylation levels. Furthermore, we found that the indices describing country's development level, expected lifespan and numerous health related indicators were positively correlated with levels. IgG galactosylation especially with monogalactosylation. We have also observed significant correlations between IgG Fc galactosylation-related glycan traits and the socioeconomic indicators. Economy and education quality are tightly connected with the development level and quality of the healthcare system [47]. As a matter of fact, all analyzed development indicators appeared to be highly codependent, making it impossible to pinpoint specific indicator associated to a distinct galactosylation change (Supplementary Table 14). It is known that besides genetics, environment also plays a crucial role in the regulation of IgG glycosylation [25, 36]. Pathogens, stress, certain medications and nutrition are the most probable players orchestrating non-genomic component of IgG glycosylation [24, 48, 49]. Low galactosylation levels suggest higher IgG inflammatory potential in some of the analyzed populations. Therefore, it would be interesting to check if participants from populations with lower IgG galactosylation had an underlying inflammatory condition at the time of sampling or if measured IgG galactosylation level represents a baseline for the studied population. However, clinical data on inflammation markers were not available for this study, warranting further research with improved study design to resolve the aforementioned predicament. Nevertheless, it was reassuring to see that

our results replicate previous findings in a recent study on 773 children from Gabon, Ghana, Ecuador, the Netherlands and Germany, where the increase in agalactosylated species was observed in individuals from Gabon, Ghana and Ecuador, compared to participants from the Netherlands and Germany. The study suggested that higher exposures to antigens in developing countries may drive pro-inflammatory IgG glycan profile and activate immune system against pathogens [38]. Significantly lower IgG Fc galactosylation levels were also observed in two African populations in comparison to US participants, associations suggesting with inflammatory glycosylation as well [50].

As already mentioned, IgG glycosylation is responsive to various environmental factors, including nutrition and use of certain medications. For instance, dietary habits vary substantially between countries, especially if we compare countries on different continents. Various diets in different regions could also be a possible source of variation in glycan profiles. It was demonstrated in mouse models that high fat diet alters IgG glycosylation, consequently activating signaling pathways that induce insulin resistance and hypertension, directly impacting cardiometabolic health [51, 52]. Additionally, use of certain medications, such as immune modifying analgesics, causes changes in immune activation [53]. The use and availability of these drugs differs significantly between the countries and could potentially represent a confounding factor to the observed changes in IgG galactosylation levels between the studied populations. However, clinical data on the use of immunomodulating drugs at the time of sampling were not available, disabling further investigation of this matter.

Our study shows differences in glycan profiles between analyzed cohorts and intriguing associations with various country development indicators, but has several limitations. Although most of our cohorts are representative of their base populations, we cannot exclude the possible existence of sampling bias in some cohorts, due to inconsistencies in inclusion criteria and lack of information on sampling methods. Example of this limitation is a cohort of Thailand sexworkers, where participants with a high risk of HIV infection were enrolled. Although all included participants were HIV negative, the group included sex workers and hepatitis positive individuals and therefore in not a true representative of Thailand's base population. We did not observe substantial differences in monogalactosylation levels for this cohort when compared to other cohorts in region (China Han). However, further studies are needed to properly check if there are differences in glycan profiles between a base population and a population with high risk of HIV infections in Thailand. Additionally, although European countries are well represented, the rest of the world is still underrepresented. For example, Uganda is the only population from African continent and this representation of genetical, socio-economical, cultural and behavioral differences cannot be generalized to the whole continent.

Additional studies with adequate number of representative participants from each of the included base populations are needed to obtain baseline populational IgG glycosylation profiles. To tackle the source of variation in glycan profiles in various populations, information on participant's health status, detailed medical history and biochemical markers would have to be collated. Unfortunately, sensibility of existing analytical methods to experimental variation and cofounding effect of age on glycan profile limits the availability of adequate sample sets for such analysis. Nevertheless, possible skewness of cohort participants in some populations should not affect and invalidate presented results and conclusions.

In summary, this observational cohort study revealed that immunoglobulin G glycosylation patterns vary within and between different populations. In addition to corroborating the previous findings on age- and sexrelated IgG glycosylation changes, we also observed associations related to participants' country of residence. Moreover, certain IgG patterns could be associated with pronounced inflammatory potential in some populations. We also obtained intriguing correlations between IgG galactosylation and various development indicators describing populational health, education and income, leaving cause of these changes as an open question to be answered by further studies.

### **MATERIALS AND METHODS**

#### **Study participants**

Total IgG glycome analysis was based on 10,482 human participants from China [36, 54], Croatia [55], Estonia and two cohorts from the United Kingdom (population of Scotland from Orkney Islands [23] and England from the TwinsUK cohort [56]; Supplementary Table 1).

Subclass specific analysis of IgG Fc glycosylation included 2,579 individuals. Volunteers originated from 14 different countries and 25 different ethnic groups (Supplementary Table 6). For Kazak and English cohorts, we had two populations obtained from different medical centers. In general, inclusion criteria required participants not to have any physiological or pathological conditions that are known to affect IgG glycosylation profile. Detailed descriptions of analyzed populations are below:

#### Trinidad and Tobago

Controls from the Latin American Genoma de Lupus Eritematoso Sistemico Network (GENLES) study were selected for analysis. Controls were selected from the same underlying population as the SLE cases of African/European genetic admixture. For each SLE case, two controls, matched for sex and for 20-year age group, were randomly chosen from the neighborhood [36]. Sampling may underrepresent predominantly Chinese and Indian populations, but 5-way admixture in samples (African, European, Indian, Chinese, Native American) reflects the diverse ancestry.

#### Han Chinese; Kazak, Kyrgyz and Uyghur minorities

Han Chinese samples were collected in Beijing (northern China) and Tangshan (eastern China) to represent the majority of Han Chinese.

Kazak, Kyrgyz and Uyghur participants were recruited from Xinjiang Autonomous Region to represent the Chinese minority ethnics. Kyrgyz samples originated from Halajun Town, Atushi City, Kizilsu Kirghiz Autonomous Prefecture. Kazak samples originated from Qapqal county, Ili Kazak Autonomous Prefecture. Uyghur samples originated from Minfeng County, Hotan Prefecture. All the participants had to meet the following inclusion criteria: signed informed consents before participation, aged more than 18 years, self-reported Kyrgyz / Kazakh/ Uyghur ethnicity without intermarriage history with other ethnic groups within at least the past three generations and no documented clinical diagnosis of specific diseases. Individuals who met the diagnostic criteria for the specific cardiovascular, respiratory, genitourinary, gastrointestinal or hematological disease were excluded from the study [29, 34, 57, 58].

#### India, England and Jamaica

Representatives for India, England and Jamaica were selected from a SABRE study. First-generation migrants from India and Jamaica were initially recruited as a population-based sample aged 40–70 years and randomly selected from ethnicity and sex-stratified primary care practitioners' lists. Only participants with no coronary heart disease, stroke and diabetes were selected for analysis. This population has the same health status as the older general population in the UK. Ethnicity was described by the interviewer based on appearance and parental origin [59].

#### **Roma population**

The Croatian Roma samples used in this study were selected the database collected from during multidisciplinary anthropological and epidemiological community-based investigations of adult Roma individuals living in Croatia. The collected samples represent a general population of adult Roma living in Croatia. The subsample presented in this cohort is created in order to equally represent both sexes and both main linguistic subgroups of the Roma: Bayash (Vlax) and Balkan Roma. Furthermore, this sample equalizes the number of individuals in 10-years age groups that are approximately the same in men and women, and in the Bayash and Balkan Roma [60].

#### Sweden

Participants were blood donors which were recruited within the Örebro region (the primary catchment area of the Örebro University Hospital). In addition to the normal requirements for blood donors, i.e. age 18–60 years, not being diagnosed with any transmittable disease or chronic disease that may impact on the composition of the blood, not having done any tattoo/piercing within the last 6 months, not undergone surgery within the last 1-6 months (depending on type of surgery) and not having any ongoing infections. Any chronic gastrointestinal symptoms were used as an exclusion criterion. The age profile of the inhabitants in the region is like that of Sweden.

#### Thailand

Participants were recruited from bars, clubs, and other locations associated with transactional sex. Men and women, 18 to 50 years of age, who were at high risk for HIV-1 infection were identified with the use of an audio computer-assisted self-interview. To be eligible for study entry, participants had to meet at least one of the following four criteria within the previous 3 months: had exchanged goods for sex, had unprotected sex with a known HIV-positive partner, had unprotected sex with three or more partners, and had symptoms of a sexually transmitted infection. Participants who were HIV -negative were analyzed in this study [61].

#### Uganda

Residents of Kayunga District, Uganda aged 15 to 49 years were enrolled. Contact information was obtained, a blood sample collected, and a questionnaire administered.

Participants also provided a medical history and received a physical examination that included observations for weight, temperature, blood pressure, pulse and presence of lymphadenopathy. A blood sample was then obtained for HIV-1 testing. Samples from HIV-negative participants were included in this study [62].

#### Evenks

Evenki samples were studied for genetic markers and biochemical traits. They are representatives of the Evenki populations of Siberia. The people studied were healthy as that population is and have minimum modern medical care.

#### Yakuts

Yakut samples were part of genetic markers study of horse ranchers of Mongolian origin. They are a more recent migrant population to Siberia.

#### Papua New Guinea

The Watut population, which is a representative of the transitional Highland populations of New Guinea, was a part of a Tropical Splenomegaly syndrome study. Analyzed samples in this study were controls that did not have the disease.

#### Slavs, Kazakhs, Tatars and Yakuts

Slavs, Kazakhs, Tatars and Yakuts were collected as part of local projects for population genetic studies. The goal was to collect conditionally healthy population controls.

Slavs were blood donors who have clinically shown no infectious and chronic diseases selected for Slavic ethnic origin. Ethnicity was evaluated in the interview process, as well as visually where people with Asian features were excluded.

Kazakhs were collected in National Center for Biotechnology, Astana, Kazakhstan. It is a conditionally healthy population control group to evaluate HLA alleles distribution in Kazakhs. Ethnicity was evaluated in the interview process.

Tatars were collected at Kazan Federal University, Kazan, Republic of Tatarstan for forensic purposes. Blood donors have clinically shown no infectious and chronic diseases. Ethnicity was evaluated in the interview process.

Yakut samples were collected in the Institute of Health, North-Eastern Federal University, Yakutsk, Russia. Samples were collected in the areas of native habitats of the Yakuts containing a pure ethnic group.

#### **Orkney and Shetland islanders**

Participants were selected among controls for patients with multiple sclerosis (MS) living on the islands or in the Grampian or Highland regions of mainland Scotland were identified by contacting general practices on the islands and reviewing MS databases held in secondary care in Aberdeen, Inverness, Orkney and Shetland. Recruitment of cases to the study was conducted through letters forwarded by general practitioners inviting those of Orcadian or Shetlandic descent to participate. [63].

#### TwinsUK population

The UK's largest registry of adult twins, or TwinsUK Registry, encompasses about 12,000 volunteer twins from all over the United Kingdom. More than 70 % of the registered twins have filled at least one detailed health questionnaire and about half of them have undergone a baseline comprehensive assessment and two follow-up clinical evaluations [56].

#### Croatia

The participants originated from the City of Split (2012-2013). The participants were recruited in the study following general practitioner's advice, newspaper and radio announcements, or distribution of posters and leaflets. In order to participate, the participants had to be of age (18 or more years) and had to sign the informed consent prior to the enrolment [64].

#### Germany

Samples representing Germany were collected in a genetic epidemiological research, based on the KORA platform (Cooperative Health Research in the Region of Augsburg). Biosamples and phenotypic characteristics, as well as environmental parameters of 18,000 adults from Augsburg and the surrounding counties are available [49].

#### Kosovo

Samples were collected from Kosovars of Albanian ethnicity in the area of Podujevo city and neighboring villages.

#### Italy

Used samples were a subgroup of 427 controls for IBD glycome project that did not have the disease.

Participants were enrolled at Careggi University Hospital in Florence, Italy [26].

#### Turkey

Samples of healthy participants were collected at Koc University, Istanbul, Turkey.

Samples were randomized across 96-well plates (31 in total), with five technical replicates of a standard sample and one blank, serving as a negative control. The development level of a country was assessed using three indices: Sustainable development health-related Development Goal index (SDG) [65], health-related Millennium Development Goals index (MDG) and United Nation Human Development Index (HDI) which is a summary measure of the development level of a certain country [65, 66] HDI represents three dimensions of life: economy, education and health quality. Specific aspects of human life were assessed using other development indicators (Supplementary Table 10). Blocking was performed by equally distributing subjects of the same sex and similar age from all the cohorts across used plates. Plasma samples used as standards were obtained from Croatian National Institute of Transfusion Medicine. The study was performed in compliance with the Helsinki declaration and all participants gave written informed consent. Ethical approvals were obtained by relevant ethics committees.

#### Immunoglobulin G isolation

For all samples, the initial material for IgG isolation was human blood plasma. Protein G affinity chromatography was used to isolate immunoglobulin G from plasma as described previously [23]. In short, the maximum volume of 100  $\mu$ L of human peripheral blood plasma or serum was diluted with 1X phosphate buffer saline (PBS) and loaded onto protein G monolithic plate (BIA Separations, Ajovščina, Slovenia). Samples were washed three times with 1X PBS and IgG was eluted using 0.1M formic acid (Merck, Darmstadt, Germany) followed by immediate neutralization with 1M ammonium bicarbonate (Acros Organics, Pittsburgh, PA).

# Immunoglobulin G trypsin digestion and purification

Subclass specific analysis of IgG Fc glycosylation included 2,579 in dividuals from 14 different countries and 25 different ethnic groups (Supplementary Table 6). We studied glycopeptides from three IgG sublessees; IgG1, IgG2 and IgG4 and each subclass was studied for various glycan features (Supplementary Tables 15, 16). IgG glycopeptides were obtained and purified as described before [49]. Approximately 15 µg of isolated IgG was treated with 0.1 µg of sequencing grade trypsin (Promega, Fitchburg, WI) and incubated overnight at 37 °C. The reaction was stopped by dilution with 0.1 % trifluoroacetic acid (TFA; Sigma-Aldrich, St. Louis, MI). Glycopeptides were purified using a solid-phase extraction on Chromabond C-18 sorbent (Macherey-Nagel, Düren, Germany). Samples were loaded onto beads in 0.1 % TFA and washed three times using the same solvent. Glycopeptides were eluted from the phase with 20 % LC-MS grade acetonitrile (ACN; Honeywell, Morris Plains, NJ). Eluted glycopeptides were vacuumdried and reconstituted in 20 µL of ultrapure water prior to LC-MS analysis. All glycan analyses were performed at Genos laboratory.

#### Release and labelling of the total IgG N-glycans

Total IgG glycome was analyzed in participants from China [36, 54], Croatia [55], Estonia, Orkney Islands [23] and the TwinsUK cohort [56] (Supplementary Table 1). Glycan release and labelling of Croatian samples were performed as previously described [28]. Briefly, IgG was incorporated into sodium dodecyl sulphate polyacrylamide gel and glycans were released from protein using an overnight incubation with PNGase F (ProZyme, Hayward, CA). Released glycans were labelled with 2-aminobenzamide (2-AB; Sigma-Aldrich) and purified on Whatman 3 mm chromatography paper. For cohorts from Scotland, England, China and Estonia, glycans were released as previously described [28, 48]. Briefly, IgG was denatured using 1.33 % (w/v) sodium dodecyl sulphate (Invitrogen, Carlsbad, CA) and samples were incubated at 65 °C for 10 minutes. Subsequently, 4 % (v/v) Igepal CA-630 (Sigma-Aldrich) and 1.25 mU of PNGase F (ProZyme) were added to each sample and incubated overnight at 37 °C. For glycan labelling, 48 mg/mL of 2-AB in dimethyl sulfoxide (Sigma-Aldrich) and glacial acetic acid (Merck) (v/v 85:15) was mixed with reducing agent (106.96 mg/mL of 2-picoline borane (Sigma-Aldrich) in dimethyl sulfoxide). Labelling mixture was added to samples, followed by 2-hour incubation at 65 °C.

After incubation, Estonian and Chinese samples were brought to 96 % ACN (J.T. Baker, Phillipsburg, NJ) and applied to each well of a 0.2  $\mu$ m GHP filter plate (Pall Corporation, Ann Arbor, MI). Samples were subsequently washed five times using acetonitrile/water (96:4, v/v). Glycans were eluted with water and stored at -20 °C until usage. Samples from England and Scotland were purified using a solid-phase extraction on 200  $\mu$ L of 0.1 g/L microcrystalline cellulose suspension (Merck) in a 0.45  $\mu$ m GHP filter plate (Pall Corporation). Deglycosylation reaction was diluted four times with ACN loaded to cellulose. Samples were washed three times with 80 % ACN and eluted with ultrapure water.

# HILIC-UPLC analysis of fluorescently labelled N-glycans

Fluorescently labelled N-glycans were separated by hydrophilic interaction liquid chromatography (HILIC) on a Waters Acquity UPLC H-class instrument (Waters, Milford, MA) equipped with FLR fluorescence detector set to 330 nm for excitation and 420 nm for emission wavelength. Separation was achieved on a Waters bridged ethylene hybrid (BEH) Glycan chromatography column, 100 × 2.1 mm i.d., 1.7 µm BEH particles with 100 mM ammonium formate (pH 4.4) as a solvent A and ACN as a solvent B. Separation method used linear gradient from 75 % to 62 % solvent B (v/v) at a flow rate of 0.4 mL/min in a 25-minute analytical run. Column temperature was maintained at 60 °C. Obtained chromatograms were manually separated into 24 peaks using Empower 3 software, from which, using the total area normalization, relative abundances of 24 directly measured glycan traits were obtained (Supplementary Table 2). In-depth characterization of each of 24 chromatographic peaks was performed as previously described [23]. The most abundant glycan structure in each peak was chosen to represent that glycan peak. An example of chromatogram integration with the most abundant glycan structures in each peak of IgG glycome is shown in Supplementary Figure 1.

### LC-MS analysis of IgG Fc glycopeptides

Trypsin-digested, subclass-specific glycopeptides were measured separated and on nanoAcquity chromatographic system (Waters, Milford, MA) coupled to Compact mass spectrometer (Bruker, Bremen, Germany), equipped with Apollo II source as described previously with minor changes [67]. Samples (9 µL) were loaded onto PepMap 100 C8 trap column (5 mm × 300 µm i.d.; Thermo Fisher Scientific, Waltham, MA) at a flow rate of 40 µL/min of solvent A (0.1 % TFA) and washed of salts and one minute. Subclass-specific impurities for glycopeptides were separated on C18 analytical column (150 mm × 100 µm i.d., 100 Å; Advanced Materials Technology, Wilmington, DE) in a gradient from 18% to 25% of solvent B (80% ACN) in solvent A. Column temperature was set to 30 °C and flow rate was 1 µl/min. NanoAcquity was coupled to mass spectrometer via capillary electrophoresis sprayer interface (Agilent, Santa Clara, CA), which allows mixing of analytical flow with sheath liquid (50 % isopropanol, 20 % propionic acid; Honeywell, Morris Plains, NJ).

Mass spectrometer was operated in a positive ion mode, with capillary voltage set to 4500 V, nebulizer pressure set to 0.4 bar and drying gas set to 4 L/min at 180 °C. Spectra were recorded in a m/z range of 600 - 1800. Collision energy was 4 eV.

IgG glycopeptides were confirmed by tandem mass spectrometry (MS/MS) analysis of a pool of 90 randomly chosen samples. MS/MS analysis was performed on Compact instrument using CaptiveSpray interface. Gaseous acetonitrile was introduced into nitrogen flow using nanoBooster. Capillary voltage was set to 1500 V with nitrogen pressure set to 0.2 bar and a temperature of 150 °C. AutoMS/MS method was used with selection of three precursor ions and exclusion criteria after one MS/MS spectrum. Mass range was set from 150 m/z to 3400 m/z and spectra rate of 1 Hz. Transfer time was set to 100 µs and pre-pulse storage was 12 µs. Used separation method was the same as for the analyzed samples, except there was no sheathingliquid flow applied to the source. Fragment spectra were manually searched for diagnostic peptide y-ion series and glycopeptide fragments specific for IgG glycopeptides (Supplementary Figures 3-5).

Obtained raw data was converted to centroid mzXML files using ProteoWizard version 3.0.1. software. Samples were internally calibrated using a defined list of IgG glycopeptides with highest signal-to-noise ratios and required isotopic patterns. After calibration, signals matching IgG Fc glycopeptides were extracted from data using 10 m/z extraction window. First four isotopic peaks of doubly and triply charged signals, belonging to the same glycopeptide species, were summed together, resulting in 20 glycopeptides per IgG subclass. Predominant allotype variant of IgG3 tryptic peptide carrying N-glycans in Caucasian population has the same amino acid sequence as IgG2. On the other hand, in Asian and African populations predominant variant of the same peptide has the same amino acid composition as IgG4 making the separation of IgG3 from other subclasses impossible using given separation methods [68]. Therefore, IgG glycopeptides were separated into three chromatographic peaks labelled IgG1, IgG2 and IgG4. Signals of interest were normalized to the total area of each IgG subclass.

#### Statistical analysis

Data analysis was performed using program R, version 3.0.1. with a ggplot2 package for creation of visualizations. Since obtained globally normalized abundances of glycan structures show the right-skewness of their distributions, data were log-transformed. To remove experimental and batch biases, all measurements were batch-corrected using ComBat R

package. Derived glycan traits representing levels of galactosylation (agalactosylation, monogalactosylation and digalactosylation), sialylation, core fucosylation and incidence of bisecting GlcNAc were calculated from obtained data as described before [23, 49]. Derived glycan traits represent a portion of structurally similar glycan species which share common biosynthetic pathways. Level of IgG glycans containing galactose was represented by agalactosylation (no galactoses), monogalactosylation (one galactose) or digalactosylation (two galactoses attached to antenna). In short, total IgG derived glycan traits were calculated as portion of glycans (%) containing common structural features (e.g. number of galactoses) in a total IgG glycome (Supplementary Table 3). In case of subclass specific IgG Fc glycopeptide analysis, derived glycan traits were calculated as a portion of glycopeptides containing common structural features within a specific IgG subclass (Supplementary Table 16). Correlations between derived glycan traits are defined in Supplementary Tables 17 and 18. Core fucosylation was excluded from IgG Fc specific glycopeptide analysis due to low data quality of non-fucosylated species.

Linear mixed model was used to analyze associations between glycan traits and the subject's country of residence (R package "lmer"). Analysis was performed using linear mixed model framework since it allows to explicitly model the hierarchical structure of our data (geographical clustering of measured samples). In the model, sex and age were described as fixed effects, while the country of residence was described as a random effect. For each variable of interest (country of residence, age and sex),  $R^2$  (variance explained) was calculated as described in Nakagawa et al. [69]. The likelihood ratio test was used to determine the significance of country of residence variability in glycan trait variability. Pearson's correlation coefficient was used to express relationships between country-specific development indicators and levels of glycan traits in participants from the same country. P values were adjusted for multiple testing using Bonferroni correction.

#### Data availability

The data that support the findings of this study are available from the corresponding author upon reasonable request. Extracted raw data from LCMS analysis is available on <u>https://www.synapse.org/</u> under ID syn21559596.

### **AUTHOR CONTRIBUTIONS**

G.L. designed the study. J.Š., N.N., G.R. and M.N. carried out LC-MS analysis. F.V. performed statistical analysis. M.P.B., I.T.A., T.K., T.Š., M.Š., I.G., and

M.V. performed UPLC analysis. M.S., H.W., Y.W., W.W., M.P.S., T.Š.J., H.C., C.H., J.F.W., I.R., O.P., I.K., S.N., L.A.E., H.K., M.L.R., M.M., P.M., J.H., M.K., V.A., K.T., C.G., T.S., T.T., N.C., M.S. and M.F. recruited participants and provided plasma samples. J.Š. drafted the manuscript. All authors edited and approved the final version.

#### **CONFLICTS OF INTEREST**

GL is founder and CEO of Genos – a private research organization that specializes in high-throughput glycomic analysis and has several patents in this field. J.Š., F.V., M.P.B., G.R., I.T.A., I.G., M.V., M.N., and T.Š. are employees of Genos.

#### FUNDING

This study was supported by European Structural and Investment Funds CEKOM grant (#KK.01.2.2.03.0006) and Croatian National Centre of Research Excellence in Personalized Healthcare grant (#KK.01.1.1.01.0010). Collection of Chinese cohorts was supported by National Natural Science Foundation of China (81573215, 81773527, 81673247 and 81370083) and Australian-China Collaborative Grant (NH&MRC-APP1112767-NSFC 81561128020). Research of Trinidad and Tobago samples was supported by the National Institute for Health Research (NIHR) Biomedical Research Centre at Guy's and St Thomas' NHS Foundation Trust and King's College London. The views expressed are those of the author(s) and not necessarily those of the NHS, the NIHR or the Department of Health. The views expressed are those of the authors and should not be construed to represent the positions of the U.S. Army, the Department of Defense, or HJF.

#### **REFERENCES**

- Vidarsson G, Dekkers G, Rispens T. IgG subclasses and allotypes: from structure to effector functions. Front Immunol. 2014; 5:520. <u>https://doi.org/10.3389/fimmu.2014.00520</u> PMID:<u>25368619</u>
- Rispens T, Vidarsson G. Chapter 9 Human IgG Subclasses. In: Antibody Fc. Linking Adaptive and Innate Immunity. 2013; pp. 159–77. https://doi.org/10.1016/B978-0-12-394802-1.00009-1
- Schur PH. IgG subclasses. A historical perspective. Monogr Allergy. 1988; 23:1–11. PMID:3290655
- Kiyoshi M, Tsumoto K, Ishii-Watabe A, Caaveiro JM. Glycosylation of IgG-fc: a molecular perspective. Int Immunol. 2017; 29:311–17.

https://doi.org/10.1093/intimm/dxx038 PMID:28655198

 Varki A, Gagneux P. Biological Functions of Glycans. 2017. In: Varki A, Cummings RD, Esko JD, Stanley P, Hart GW, Aebi M, Darvill AG, Kinoshita T, Packer NH, Prestegard JH, Schnaar RL, Seeberger PH, editors. Essentials of Glycobiology. 3rd ed. Cold Spring Harbor (NY): Cold Spring Harbor Laboratory Press; 2015–2017. Chapter 7.

https://doi.org/10.1101/glycobiology.3e.007 PMID:28876862

- Arnold JN, Wormald MR, Sim RB, Rudd PM, Dwek RA. The impact of glycosylation on the biological function and structure of human immunoglobulins. Annu Rev Immunol. 2007; 25:21–50. <u>https://doi.org/10.1146/annurev.immunol.25.022106.</u> <u>141702</u> PMID:<u>17029568</u>
- Wuhrer M, Stam JC, van de Geijn FE, Koeleman CA, Verrips CT, Dolhain RJ, Hokke CH, Deelder AM. Glycosylation profiling of immunoglobulin G (lgG) subclasses from human serum. Proteomics. 2007; 7:4070–81. <u>https://doi.org/10.1002/pmic.200700289</u> PMID:17994628
- Schroeder HW Jr, Cavacini L. Structure and function of immunoglobulins. J Allergy Clin Immunol. 2010; 125:S41–52. <u>https://doi.org/10.1016/j.jaci.2009.09.046</u> PMID:<u>20176268</u>
- Potter M. Structural correlates of immunoglobulin diversity. Surv Immunol Res. 1983; 2:27–42. <u>https://doi.org/10.1007/BF02918394</u> PMID:<u>6417753</u>
- Lee HS, Im W. Effects of n-glycan composition on structure and dynamics of IgG1 fc and their implications for antibody engineering. Sci Rep. 2017; 7:12659. <u>https://doi.org/10.1038/s41598-017-12830-5</u> PMID:28978918
- Houde D, Peng Y, Berkowitz SA, Engen JR. Posttranslational modifications differentially affect IgG1 conformation and receptor binding. Mol Cell Proteomics. 2010; 9:1716–28. <u>https://doi.org/10.1074/mcp.M900540-MCP200</u> PMID:20103567
- Gudelj I, Lauc G, Pezer M. Immunoglobulin G glycosylation in aging and diseases. Cell Immunol. 2018; 333:65–79. <u>https://doi.org/10.1016/j.cellimm.2018.07.009</u> PMID:<u>30107893</u>
- 13. Banda NK, Wood AK, Takahashi K, Levitt B, Rudd PM, Royle L, Abrahams JL, Stahl GL, Holers VM, Arend WP. Initiation of the alternative pathway of murine

complement by immune complexes is dependent on nglycans in IgG antibodies. Arthritis Rheum. 2008; 58:3081–89.

https://doi.org/10.1002/art.23865 PMID:18821684

- 14. Malhotra R, Wormald MR, Rudd PM, Fischer PB, Dwek RA, Sim RB. Glycosylation changes of IgG associated with rheumatoid arthritis can activate complement via the mannose-binding protein. Nat Med. 1995; 1:237–43. <u>https://doi.org/10.1038/nm0395-237</u> PMID:7585040
- Karsten CM, Pandey MK, Figge J, Kilchenstein R, Taylor PR, Rosas M, McDonald JU, Orr SJ, Berger M, Petzold D, Blanchard V, Winkler A, Hess C, et al. Antiinflammatory activity of IgG1 mediated by fc galactosylation and association of FcγRIIB and dectin-1. Nat Med. 2012; 18:1401–06. <u>https://doi.org/10.1038/nm.2862</u> PMID:<u>22922409</u>
- Mihai S, Nimmerjahn F. The role of fc receptors and complement in autoimmunity. Autoimmun Rev. 2013; 12:657–60. <u>https://doi.org/10.1016/j.autrev.2012.10.008</u> PMID:<u>23201918</u>
- Thomann M, Reckermann K, Reusch D, Prasser J, Tejada ML. Fc-galactosylation modulates antibodydependent cellular cytotoxicity of therapeutic antibodies. Mol Immunol. 2016; 73:69–75. <u>https://doi.org/10.1016/j.molimm.2016.03.002</u> PMID:<u>27058641</u>
- Peschke B, Keller CW, Weber P, Quast I, Lünemann JD. Fc-galactosylation of human immunoglobulin gamma isotypes improves C1q binding and enhances complement-dependent cytotoxicity. Front Immunol. 2017; 8:646. https://doi.org/10.3389/fimmu.2017.00646

PMID:<u>28634480</u>

- Kurimoto A, Kitazume S, Kizuka Y, Nakajima K, Oka R, Fujinawa R, Korekane H, Yamaguchi Y, Wada Y, Taniguchi N. The absence of core fucose up-regulates GnT-III and Wnt target genes: a possible mechanism for an adaptive response in terms of glycan function. J Biol Chem. 2014; 289:11704–14. <u>https://doi.org/10.1074/jbc.M113.502542</u> PMID:<u>24619415</u>
- Washburn N, Schwab I, Ortiz D, Bhatnagar N, Lansing JC, Medeiros A, Tyler S, Mekala D, Cochran E, Sarvaiya H, Garofalo K, Meccariello R, Meador JW 3rd, et al. Controlled tetra-fc sialylation of IVIg results in a drug candidate with consistent enhanced anti-inflammatory activity. Proc Natl Acad Sci USA. 2015; 112:E1297–306. <u>https://doi.org/10.1073/pnas.1422481112</u> PMID:<u>25733881</u>

- Seeling M, Brückner C, Nimmerjahn F. Differential antibody glycosylation in autoimmunity: sweet biomarker or modulator of disease activity? Nat Rev Rheumatol. 2017; 13:621–30. <u>https://doi.org/10.1038/nrrheum.2017.146</u> PMID:28905852
- Jennewein MF, Alter G. The immunoregulatory roles of antibody glycosylation. Trends Immunol. 2017; 38:358–72.

https://doi.org/10.1016/j.it.2017.02.004 PMID:28385520

 Pucić M, Knezević A, Vidic J, Adamczyk B, Novokmet M, Polasek O, Gornik O, Supraha-Goreta S, Wormald MR, Redzić I, Campbell H, Wright A, Hastie ND, et al. High throughput isolation and glycosylation analysis of IgGvariability and heritability of the IgG glycome in three isolated human populations. Mol Cell Proteomics. 2011; 10:M111.010090.

https://doi.org/10.1074/mcp.M111.010090 PMID:<u>21653738</u>

- Plomp R, Ruhaak LR, Uh HW, Reiding KR, Selman M, Houwing-Duistermaat JJ, Slagboom PE, Beekman M, Wuhrer M. Subclass-specific IgG glycosylation is associated with markers of inflammation and metabolic health. Sci Rep. 2017; 7:12325. <u>https://doi.org/10.1038/s41598-017-12495-0</u> PMID:28951559
- 25. Nikolac Perkovic M, Pucic Bakovic M, Kristic J, Novokmet M, Huffman JE, Vitart V, Hayward C, Rudan I, Wilson JF, Campbell H, Polasek O, Lauc G, Pivac N. The association between galactosylation of immunoglobulin G and body mass index. Prog Neuropsychopharmacol Biol Psychiatry. 2014; 48:20–25. <u>https://doi.org/10.1016/j.pnpbp.2013.08.014</u> PMID:24012618
- 26. Šimurina M, de Haan N, Vučković F, Kennedy NA, Štambuk J, Falck D, Trbojević-Akmačić I, Clerc F, Razdorov G, Khon A, Latiano A, D'Incà R, Danese S, et al, and Inflammatory Bowel Disease Biomarkers Consortium. Glycosylation of immunoglobulin G associates with clinical features of inflammatory bowel diseases. Gastroenterology. 2018; 154:1320–33.e10. https://doi.org/10.1053/j.gastro.2018.01.002 PMID:29309774
- Sha S, Agarabi C, Brorson K, Lee DY, Yoon S. Nglycosylation design and control of therapeutic monoclonal antibodies. Trends Biotechnol. 2016; 34:835–46. <u>https://doi.org/10.1016/j.tibtech.2016.02.013</u> PMID:27016033
- Krištić J, Vučković F, Menni C, Klarić L, Keser T, Beceheli I, Pučić-Baković M, Novokmet M, Mangino M, Thaqi K, Rudan P, Novokmet N, Sarac J, et al. Glycans are a

novel biomarker of chronological and biological ages. J Gerontol A Biol Sci Med Sci. 2014; 69:779–89. <u>https://doi.org/10.1093/gerona/glt190</u> PMID:<u>24325898</u>

- 29. Yan YX, Dong J, Liu YQ, Yang XH, Li M, Shia G, Wang W. Association of suboptimal health status and cardiovascular risk factors in urban Chinese workers. J Urban Health. 2012; 89:329–38. <u>https://doi.org/10.1007/s11524-011-9636-8</u> PMID:<u>22203493</u>
- 30. van de Geijn FE, Wuhrer M, Selman MH, Willemsen SP, de Man YA, Deelder AM, Hazes JM, Dolhain RJ. Immunoglobulin G galactosylation and sialylation are associated with pregnancy-induced improvement of rheumatoid arthritis and the postpartum flare: results from a large prospective cohort study. Arthritis Res Ther. 2009; 11:R193. https://doi.org/10.1196/ar2802.0MUD:20015275

https://doi.org/10.1186/ar2892 PMID:20015375

- Chen G, Wang Y, Qiu L, Qin X, Liu H, Wang X, Wang Y, Song G, Li F, Guo Y, Li F, Guo S, Li Z. Human IgG fcglycosylation profiling reveals associations with age, sex, female sex hormones and thyroid cancer. J Proteomics. 2012; 75:2824–34. <u>https://doi.org/10.1016/j.jprot.2012.02.001</u> PMID:22365975
- 32. López-Otín C, Blasco MA, Partridge L, Serrano M, Kroemer G. The hallmarks of aging. Cell. 2013; 153:1194–217. <u>https://doi.org/10.1016/j.cell.2013.05.039</u> PMID:23746838
- 33. Prattichizzo F, De Nigris V, Spiga R, Mancuso E, La Sala L, Antonicelli R, Testa R, Procopio AD, Olivieri F, Ceriello A. Inflammageing and metaflammation: the yin and yang of type 2 diabetes. Ageing Res Rev. 2018; 41:1–17. <u>https://doi.org/10.1016/j.arr.2017.10.003</u> PMID:<u>29081381</u>
- 34. Yu X, Wang Y, Kristic J, Dong J, Chu X, Ge S, Wang H, Fang H, Gao Q, Liu D, Zhao Z, Peng H, Pucic Bakovic M, et al. Profiling IgG n-glycans as potential biomarker of chronological and biological ages: a community-based study in a han Chinese population. Medicine (Baltimore). 2016; 95:e4112. https://doi.org/10.1097/MD.000000000004112 PMID:27428197
- Lauc G, Pezer M, Rudan I, Campbell H. Mechanisms of disease: the human n-glycome. Biochim Biophys Acta. 2016; 1860:1574–82. <u>https://doi.org/10.1016/j.bbagen.2015.10.016</u> PMID:<u>26500099</u>
- Vučković F, Krištić J, Gudelj I, Teruel M, Keser T, Pezer M, Pučić-Baković M, Štambuk J, Trbojević-Akmačić I, Barrios C, Pavić T, Menni C, Wang Y, et al. Association

of systemic lupus erythematosus with decreased immunosuppressive potential of the IgG glycome. Arthritis Rheumatol. 2015; 67:2978–89. https://doi.org/10.1002/art.39273 PMID:26200652

- Huffman JE, Pučić-Baković M, Klarić L, Hennig R, Selman MH, Vučković F, Novokmet M, Krištić J, Borowiak M, Muth T, Polašek O, Razdorov G, Gornik O, et al. Comparative performance of four methods for high-throughput glycosylation analysis of immunoglobulin G in genetic and epidemiological research. Mol Cell Proteomics. 2014; 13:1598–610. <u>https://doi.org/10.1074/mcp.M113.037465</u> PMID:<u>24719452</u>
- 38. de Jong SE, Selman MH, Adegnika AA, Amoah AS, van Riet E, Kruize YC, Raynes JG, Rodriguez A, Boakye D, von Mutius E, Knulst AC, Genuneit J, Cooper PJ, et al. IgG1 fc n-glycan galactosylation as a biomarker for immune activation. Sci Rep. 2016; 6:28207. https://doi.org/10.1038/srep28207 PMID:27306703
- Ercan A, Kohrt WM, Cui J, Deane KD, Pezer M, Yu EW, Hausmann JS, Campbell H, Kaiser UB, Rudd PM, Lauc G, Wilson JF, Finkelstein JS, Nigrovic PA. Estrogens regulate glycosylation of IgG in women and men. JCI Insight. 2017; 2:e89703. <u>https://doi.org/10.1172/jci.insight.89703</u> PMID:28239652
- Hughes GC, Choubey D. Modulation of autoimmune rheumatic diseases by oestrogen and progesterone. Nat Rev Rheumatol. 2014; 10:740–51. <u>https://doi.org/10.1038/nrrheum.2014.144</u>
  PMID:25155581
- Vanhooren V, Dewaele S, Libert C, Engelborghs S, De Deyn PP, Toussaint O, Debacq-Chainiaux F, Poulain M, Glupczynski Y, Franceschi C, Jaspers K, van der Pluijm I, Hoeijmakers J, Chen CC. Serum n-glycan profile shift during human ageing. Exp Gerontol. 2010; 45:738–43. <u>https://doi.org/10.1016/j.exger.2010.08.009</u> PMID:<u>20801208</u>
- 42. Sanada F, Taniyama Y, Muratsu J, Otsu R, Shimizu H, Rakugi H, Morishita R. Source of chronic inflammation in aging. Front Cardiovasc Med. 2018; 5:12. <u>https://doi.org/10.3389/fcvm.2018.00012</u> PMID:<u>29564335</u>
- Alavi A, Arden N, Spector TD, Axford JS. Immunoglobulin G glycosylation and clinical outcome in rheumatoid arthritis during pregnancy. J Rheumatol. 2000; 27:1379–85. PMID:10852257
- 44. Keusch J, Lydyard PM, Berger EG, Delves PJ. B lymphocyte galactosyltransferase protein levels in normal individuals and in patients with rheumatoid

arthritis. Glycoconj J. 1998; 15:1093–97. https://doi.org/10.1023/a:1006957711557 PMID:<u>10386894</u>

45. Omtvedt LA, Royle L, Husby G, Sletten K, Radcliffe CM, Harvey DJ, Dwek RA, Rudd PM. Glycan analysis of monoclonal antibodies secreted in deposition disorders indicates that subsets of plasma cells differentially process IgG glycans. Arthritis Rheum. 2006; 54:3433–40.

https://doi.org/10.1002/art.22171 PMID:17075835

- 46. Ferrucci L, Fabbri E. Inflammageing: chronic inflammation in ageing, cardiovascular disease, and frailty. Nat Rev Cardiol. 2018; 15:505–22. <u>https://doi.org/10.1038/s41569-018-0064-2</u> PMID:<u>30065258</u>
- Menni C, Keser T, Mangino M, Bell JT, Erte I, Akmačić I, Vučković F, Pučić Baković M, Gornik O, McCarthy MI, Zoldoš V, Spector TD, Lauc G, Valdes AM. Glycosylation of immunoglobulin G: role of genetic and epigenetic influences. PLoS One. 2013; 8:e82558. <u>https://doi.org/10.1371/journal.pone.0082558</u> PMID:<u>24324808</u>
- Menni C, Gudelj I, Macdonald-Dunlop E, Mangino M, Zierer J, Bešić E, Joshi PK, Trbojević-Akmačić I, Chowienczyk PJ, Spector TD, Wilson JF, Lauc G, Valdes AM. Glycosylation profile of immunoglobulin G is crosssectionally associated with cardiovascular disease risk score and subclinical atherosclerosis in two independent cohorts. Circ Res. 2018; 122:1555–64. <u>https://doi.org/10.1161/CIRCRESAHA.117.312174</u> PMID:<u>29535164</u>
- Wittenbecher C, Štambuk T, Kuxhaus O, Rudman N, Vučković F, Štambuk J, Schiborn C, Rahelić D, Dietrich S, Gornik O, Perola M, Boeing H, Schulze MB, Lauc G. Plasma N-glycans as emerging biomarkers of cardiometabolic risk: a prospective investigation in the EPIC-potsdam cohort study. Diabetes Care. 2020; 43:661–68.

https://doi.org/10.2337/dc19-1507 PMID:31915204

- 50. Vonaesch P, Morien E, Andrianonimiadana L, Sanke H, Mbecko JR, Huus KE, Naharimanananirina T, Gondje BP, Nigatoloum SN, Vondo SS, Kaleb Kandou JE, Randremanana R, Rakotondrainipiana M, et al, and Afribiota Investigators. Stunted childhood growth is associated with decompartmentalization of the gastrointestinal tract and overgrowth of oropharyngeal taxa. Proc Natl Acad Sci USA. 2018; 115:E8489–98. <u>https://doi.org/10.1073/pnas.1806573115</u> PMID:<u>30126990</u>
- Dall'Olio F, Vanhooren V, Chen CC, Slagboom PE, Wuhrer M, Franceschi C. N-glycomic biomarkers of biological aging and longevity: a link with inflammaging. Ageing Res Rev. 2013; 12:685–98.

https://doi.org/10.1016/j.arr.2012.02.002 PMID:22353383

- 52. Calixto OJ, Anaya JM. Socioeconomic status. The relationship with health and autoimmune diseases. Autoimmun Rev. 2014; 13:641–54. <u>https://doi.org/10.1016/j.autrev.2013.12.002</u> PMID:<u>24418307</u>
- Wang Y, Klarić L, Yu X, Thaqi K, Dong J, Novokmet M, Wilson J, Polasek O, Liu Y, Krištić J, Ge S, Pučić-Baković M, Wu L, et al. The association between glycosylation of immunoglobulin G and hypertension: a multiple ethnic cross-sectional study. Medicine (Baltimore). 2016; 95:e3379. <u>https://doi.org/10.1097/MD.00000000003379</u> PMID:27124023
- 54. Rudan I, Marusić A, Janković S, Rotim K, Boban M, Lauc G, Grković I, Dogas Z, Zemunik T, Vatavuk Z, Bencić G, Rudan D, Mulić R, et al. "10001 dalmatians:" Croatia launches its national biobank. Croat Med J. 2009; 50:4–6. <u>https://doi.org/10.3325/cmj.2009.50.4</u> PMID:<u>19260138</u>
- Moayyeri A, Hammond CJ, Valdes AM, Spector TD. Cohort profile: TwinsUK and healthy ageing twin study. Int J Epidemiol. 2013; 42:76–85. <u>https://doi.org/10.1093/ije/dyr207</u> PMID:<u>22253318</u>
- Wang Y, Ge S, Yan Y, Wang A, Zhao Z, Yu X, Qiu J, Alzain MA, Wang H, Fang H, Gao Q, Song M, Zhang J, et al. China suboptimal health cohort study: rationale, design and baseline characteristics. J Transl Med. 2016; 14:291.

<u>https://doi.org/10.1186/s12967-016-1046-y</u> PMID:27737677

- 57. Liu JN, Dolikun M, Štambuk J, Trbojević-Akmačić I, Zhang J, Wang H, Zheng DQ, Zhang XY, Peng HL, Zhao ZY, Liu D, Sun Y, Sun Q, et al. The association between subclass-specific IgG fc n-glycosylation profiles and hypertension in the uygur, kazak, kirgiz, and tajik populations. J Hum Hypertens. 2018; 32:555–63. <u>https://doi.org/10.1038/s41371-018-0071-0</u> PMID:29867134
- 58. Tillin T, Forouhi NG, McKeigue PM, Chaturvedi N, and SABRE Study Group. Southall and brent REvisited: cohort profile of SABRE, a UK population-based comparison of cardiovascular disease and diabetes in people of European, Indian Asian and African Caribbean origins. Int J Epidemiol. 2012; 41:33–42. https://doi.org/10.1093/ije/dyq175 PMID:21044979
- 59. Tomas Ž, Kuhanec A, Škarić-Jurić T, Petranović MZ, Narančić NS, Janićijević B, Salihović MP. Distinctiveness of the roma population within CYP2B6 worldwide variation. Pharmacogenomics. 2017; 18:1575–87.

https://doi.org/10.2217/pgs-2017-0105 PMID:29095103

 Robb ML, Eller LA, Kibuuka H, Rono K, Maganga L, Nitayaphan S, Kroon E, Sawe FK, Sinei S, Sriplienchan S, Jagodzinski LL, Malia J, Manak M, et al, and RV 217 Study Team. Prospective study of acute HIV-1 infection in adults in East Africa and Thailand. N Engl J Med. 2016; 374:2120–30. https://doi.org/10.1056/NEJMoa1508952

PMID:27192360

 Guwatudde D, Wabwire-Mangen F, Eller LA, Eller M, McCutchan F, Kibuuka H, Millard M, Sewankambo N, Serwadda D, Michael N, Robb M, and Kayunga Cohort Research Team. Relatively low HIV infection rates in rural Uganda, but with high potential for a rise: a cohort study in Kayunga district, Uganda. PLoS One. 2009; 4:e4145. https://doi.org/10.1371/journal.pone.0004145

PMID:<u>19127290</u>

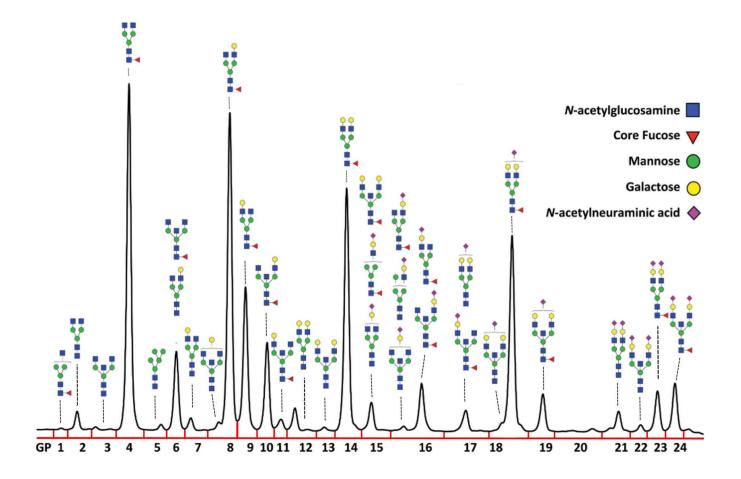
- McWhirter RE, McQuillan R, Visser E, Counsell C, Wilson JF. Genome-wide homozygosity and multiple sclerosis in Orkney and Shetland islanders. Eur J Hum Genet. 2012; 20:198–202. <u>https://doi.org/10.1038/ejhg.2011.170</u> PMID:21897447
- Benedetti E, Pučić-Baković M, Keser T, Wahl A, Hassinen A, Yang JY, Liu L, Trbojević-Akmačić I, Razdorov G, Štambuk J, Klarić L, Ugrina I, Selman MH, et al. Network inference from glycoproteomics data reveals new reactions in the IgG glycosylation pathway. Nat Commun. 2017; 8:1483. <u>https://doi.org/10.1038/s41467-017-01525-0</u> PMID:29133956
- 64. Keser T, Vučković F, Barrios C, Zierer J, Wahl A, Akinkuolie AO, Štambuk J, Nakić N, Pavić T, Periša J, Mora S, Gieger C, Menni C, et al. Effects of statins on the immunoglobulin G glycome. Biochim Biophys Acta Gen Subj. 2017; 1861:1152–58.

https://doi.org/10.1016/j.bbagen.2017.02.029 PMID:28263871

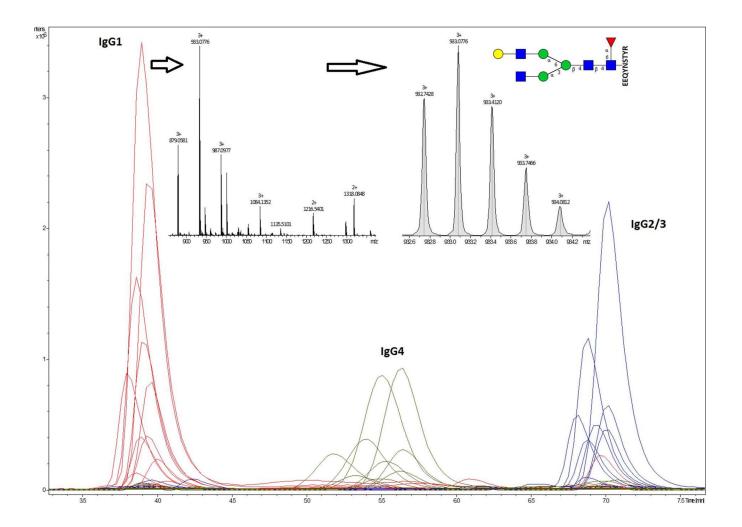
- 65. GBD 2015 SDG Collaborators. Measuring the healthrelated sustainable development goals in 188 countries: a baseline analysis from the global burden of disease study 2015. Lancet. 2016; 388:1813–50. <u>https://doi.org/10.1016/S0140-6736(16)31467-2</u> PMID:<u>27665228</u>
- United Nations Development Programme. Human Development Reports 1990-2019. Human Development Data. <u>http://hdr.undp.org/en/data</u>
- 67. Selman MH, Derks RJ, Bondt A, Palmblad M, Schoenmaker B, Koeleman CA, van de Geijn FE, Dolhain RJ, Deelder AM, Wuhrer M. Fc specific IgG glycosylation profiling by robust nano-reverse phase HPLC-MS using a sheath-flow ESI sprayer interface. J Proteomics. 2012; 75:1318–29. <u>https://doi.org/10.1016/j.jprot.2011.11.003</u> PMID:22120122
- Plomp R, Bondt A, de Haan N, Rombouts Y, Wuhrer M. Recent advances in clinical glycoproteomics of immunoglobulins (igs). Mol Cell Proteomics. 2016; 15:2217–28. <u>https://doi.org/10.1074/mcp.0116.058503</u> PMID:27009965
- 69. Nakagawa S, Schielzeth H. A general and simple method for obtaining R2 from generalized linear mixed-effects models. Methods Ecol Evol. 2013; 4:133–42. https://doi.org/10.1111/j.2041-210x.2012.00261.x

#### SUPPLEMENTARY MATERIALS

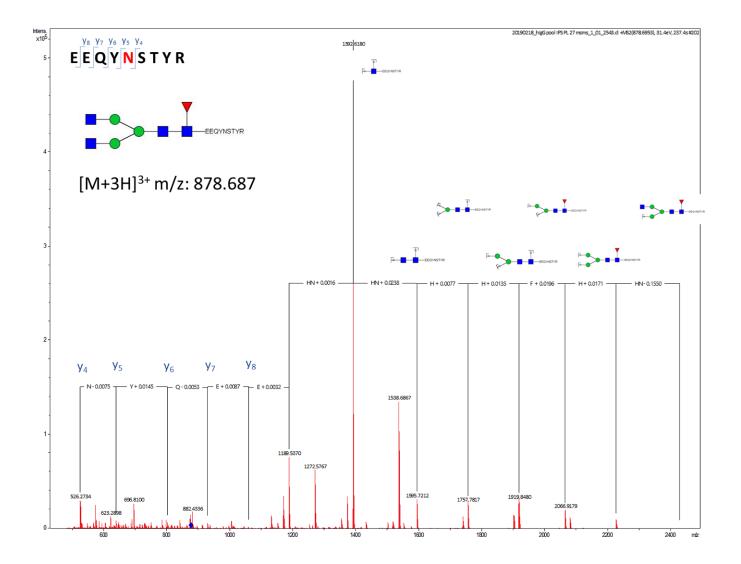
#### **Supplementary Figures**



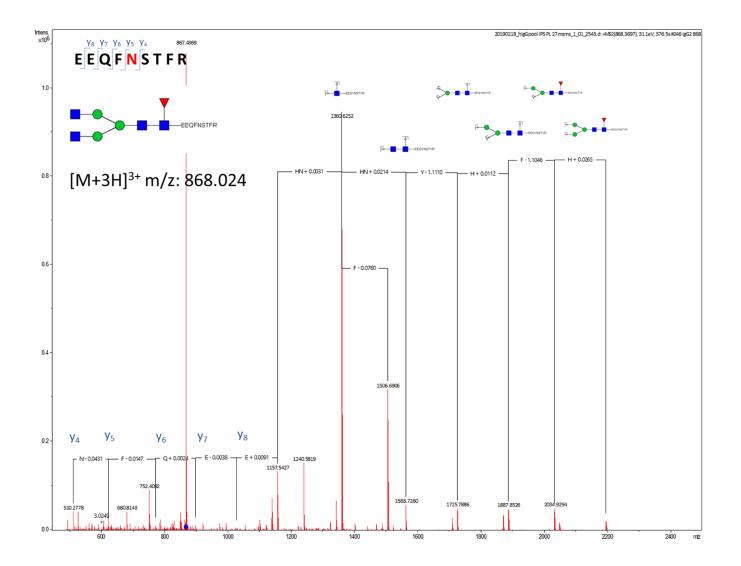
**Supplementary Figure 1. HILIC-UPLC chromatogram of total IgG released glycans labelled with 2-AB.** Dominant structures are indicated above each of 24 glycan peaks (GP 1 - 24).



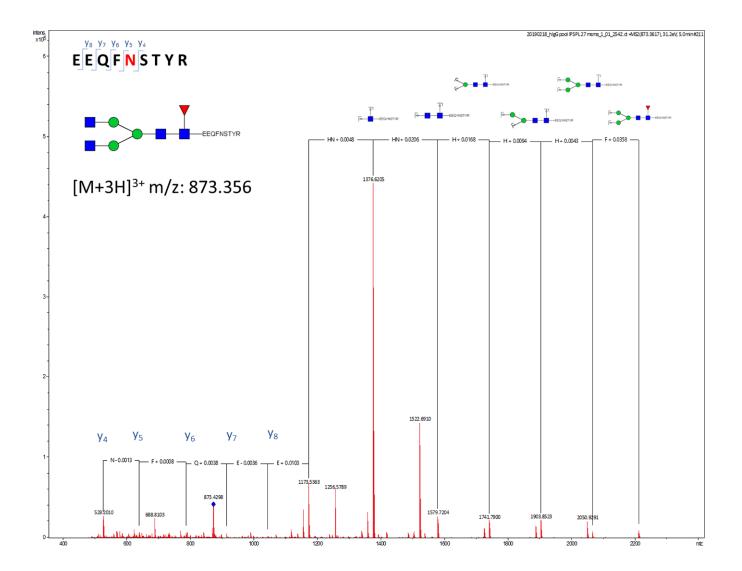
**Supplementary Figure 2. Extracted ion chromatograms of IgG Fc glycopeptides.** IgG1 subclass is shown in red, IgG4 in green and IgG2 in blue. Mass spectra containing masses that correspond to IgG1 glycopeptides and isotopic distribution of the most abundant glycopeptide (G1F) are shown.



**Supplementary Figure 3. Fragment spectra of GOF glycan attached to IgG1 tryptic fragment.** Glycan composition: N (N-acetylglucosamine), F (fucose), G (galactose) and S (N-acetylneuraminic acid) followed by a number represents number and type of monosaccharides attached to A2 glycan. Glycan structures are drawn in GlycoWorkbench version 2. Blue square = N-acetylglucosamine, red triangle = fucose, green circle = mannose, yellow circle = galactose, purple diamond = N-acetylneuraminic acid. IgG1 tryptic peptide sequence carrying glycan: E293EQYNSTYR301.



**Supplementary Figure 4. Fragment spectra of GOF glycan attached to IgG2&3 tryptic fragment.** Glycan composition: N (N-acetylglucosamine), F (fucose), G (galactose) and S (N-acetylneuraminic acid) followed by a number represents number and type of monosaccharides attached to A2 glycan. Glycan structures are drawn in GlycoWorkbench version 2. Blue square = N-acetylglucosamine, red triangle = fucose, green circle = mannose, yellow circle = galactose, purple diamond = N-acetylneuraminic acid. IgG2&3 tryptic peptide sequence carrying glycan: E293EQFNSTYR301.



**Supplementary Figure 5. Fragment spectra of GOF glycan attached to IgG4 tryptic fragment.** Glycan composition: N (N-acetylglucosamine), F (fucose), G (galactose) and S (N-acetylneuraminic acid) followed by a number represents number and type of monosaccharides attached to A2 glycan. Glycan structures are drawn in GlycoWorkbench version 2. Blue square = N-acetylglucosamine, red triangle = fucose, green circle = mannose, yellow circle = galactose, purple diamond = N-acetylneuraminic acid. IgG4 tryptic peptide sequence carrying glycan: E293EQFNSTFR301.

### **Supplementary Tables**

Supplementary Table 1. Demographic characteristics of five populations used for HILIC-UPLC analysis of total IgG glycosylation.

Population	Abbreviation	Country of residence	Min age	Q1	Median	Mean	Q3	Max age	F	М
General population of China (Han)	China	China	20	43	48	47	51	68	423	201
General population of Croatia	Croatia	Croatia	18	46	57	56	68	98	1116	689
General population of Estonia	Estonia	Estonia	31	60	69	67	75	88	516	593
Population of Orkney Islands	Scotland	Scotland	17	41	54	53	65	100	1236	794
General population of England (TwinsUK cohort)	England	England	17	42	54	52	62	83	4282	342

In table are given: abbreviation of analysed population, country of participant's residence, age parameters (minimum, maximum, median, mean, 1<sup>st</sup> and 3<sup>rd</sup> quartile) and sex parameters (number of female and male participants).

Glycan peak	The most abundant glycan structure <sup>1</sup>	Description of glycan trait	Trait calculation <sup>2</sup>
GP1	<b>-</b>	The percentage of FA1 glycan in total IgG glycans	GP1 / TOTAL GLYCANS* 100
GP2		The percentage of A2 glycan in total IgG glycans	GP2 / TOTAL GLYCANS* 100
GP3		The percentage of A2B glycan in total IgG glycans	GP3 / TOTAL GLYCANS* 100
GP4		The percentage of FA2 glycan in total IgG glycans	GP4 / TOTAL GLYCANS* 100
GP5	*****	The percentage of M5 glycan in total IgG glycans	GP5 / TOTAL GLYCANS* 100
GP6		The percentage of FA2B glycan in total IgG glycans	GP6 / TOTAL GLYCANS* 100
GP7	<b>⋳</b> -{ <b>■</b> - <b>0</b> <b>■</b> - <b>0</b>	The percentage of A2G1 glycan in total IgG glycans	GP7 / TOTAL GLYCANS* 100
GP8	0-8-0, ¥ 8-0 - 8-8	The percentage of FA2[6]G1 glycan in total IgG glycans	GP8 / TOTAL GLYCANS* 100
GP9		The percentage of FA2[3]G1 glycan in total IgG glycans	GP9 / TOTAL GLYCANS* 100
GP10		The percentage of FA2[6]BG1 glycan in total IgG glycans	GP10 / TOTAL GLYCANS* 100
GP11		The percentage of FA2[3]BG1 glycan in total IgG glycans	GP11 / TOTAL GLYCANS* 100
GP12		The percentage of A2G2 glycan in total IgG glycans	GP12 / TOTAL GLYCANS* 100
GP13		The percentage of $A2BG2$ glycan in total IgG	GP13 / TOTAL GLYCANS* 100
GP14		glycans The percentage of FA2G2 glycan in total IgG	GP14 / TOTAL GLYCANS* 100
GP15		glycans The percentage of FA2BG2 glycan in total IgG	GP15 / TOTAL GLYCANS* 100
GP16	◆ <b>●</b> - { <b>■</b> • <b>● ● ● ●</b>	glycans The percentage of FA2G1S1 glycan in total IgG	GP16 / TOTAL GLYCANS* 100
GP17	◆{ <mark>○■●</mark> ●■●	glycans The percentage of A2G2S1 glycan in total IgG	GP17/ TOTAL GLYCANS* 100
GP18		glycans The percentage of FA2G2S1 glycan in total IgG	GP18 / TOTAL GLYCANS* 100
GP19		glycans The percentage of FA2BG2S1 glycan in total IgG glycans	GP19 / TOTAL GLYCANS* 100
GP20		Structure not determined	GP20 / TOTAL GLYCANS* 100
GP21	+	The percentage of A2G2S2 glycan in total IgG glycans	GP21 / TOTAL GLYCANS* 100
GP22	+	The percentage of A2BG2S2 glycan in total IgG glycans	GP22 / TOTAL GLYCANS* 100
GP23		The percentage of $FA2G2S2$ glycan in total IgG	GP23 / TOTAL GLYCANS* 100
GP24	<b>₽</b> ₽₽₽ <b>+</b> ○₽●	glycans The percentage of FA2BG2S2 glycan in total IgG glycans	GP24 / TOTAL GLYCANS* 100

### Supplementary Table 2. Description of directly measured traits measured by HILIC-UPLC.

#### Supplementary Table 3. Description of derived IgG glycan traits measured by HILIC-UPLC with correlations between derived glycan traits.

Derived glycan trait	Derived trait description	Derived trait calculation					
Core fugarilation	Fraction of structures containing	GP1+GP4+GP6+GP8+GP9+GP10+GP11+GP14+GP15+GP16+GP18+GP19+GP23+					
Core fucosylation	core fucose in total IgG glycans	GP24					
	Fraction of structures containing						
Bisecting GlcNAc	bisecting GlcNAc in total IgG	GP3+GP6+GP10+GP11+GP13+GP15+GP19+GP22+GP24					
	glycans						
A = -1+1-+	Fraction of agalactosylated	CD1 + CD2 + CD2 + CD4 + CD5 + CD6					
Agalactosylation	structures in total IgG glycans	GP1+GP2+GP3+GP4+GP5+GP6					
	Fraction of structures containing						
Monogalactosylation	one galactose in total IgG	GP7+GP8+GP9+GP10+GP11+GP16					
	glycans						
	Fraction of structures containing						
Digalactosylation	two galactoses in total IgG	GP12+GP13+GP14+GP15+GP17+GP18+GP19+GP20+GP21+GP22+GP23+GP24					
	glycans						
Q:-1-1-4:	Fraction of structures containing						
Sialylation	sialic acid in total IgG glycans	GP16+GP17+GP18+GP19+GP20+GP21+GP22+GP23+GP24					

<sup>1</sup>Glycan structures are drawn in GlycoWorkbench version 2. blue square = N-acetylglucosamine, red triangle = fucose, green circle = mannose, yellow circle = galactose, purple diamond = N-acetylneuraminic acid.

<sup>2</sup>Total glycans = sum of all 24 glycan peaks.

	Cohort	Min.	1st Qu.	Median	Mean	3rd Qu.	Max.
Agalactosylation	China	9,232	16,45	19,96	20,46	23,5	48,04
	Croatia	8,679	21,88	27,06	27,33	32,53	55,42
	Estonia	10,62	31,26	36,24	36,31	41,14	72,63
	Scotland	8,727	18,93	24,03	24,67	29,72	60,62
	England	7,458	19,21	24,6	25,29	30,52	63,45
Monogalactosylation	China	27,24	33,38	35,04	34,82	36,44	42,06
	Croatia	20,18	29,07	30,76	30,58	32,4	39,36
	Estonia	17,39	32,57	34,29	33,99	35,78	45,23
	Scotland	23,51	34,01	35,62	35,43	37,12	44,54
	England	22,7	34,68	36,21	36,02	37,55	49,37
Digalactosylation	China	7,297	19,07	21,86	21,76	24,6	33,82
	Croatia	4,603	11,33	13,75	14,26	16,72	29,7
	Estonia	3,129	10,32	12,43	12,69	14,8	26,02
	Scotland	5,246	14,09	17,12	17,52	20,65	35,39
	England	4,536	14,49	17,9	18,12	21,63	35,39
Bisecting GlcNAc	China	8,992	14,17	15,58	15,79	17,18	26,98
	Croatia	11,1	16,82	18,4	18,49	19,99	29,32
	Estonia	5,771	16,56	18,17	18,32	19,87	29,48
	Scotland	8,377	14,88	16,45	16,71	18,46	36,53
	England	6,958	15,24	16,96	17,17	18,9	32,23
Sialylation	China	12,3	20,62	22,92	22,95	25,37	33,51
	Croatia	13,32	24,26	27,33	27,83	30,93	51,82
	Estonia	4,63	14,97	16,74	17	18,82	39,29
	Scotland	10,3	19,62	22,16	22,37	25,05	36,94
	England	3,008	17,87	20,35	20,58	23,23	49,82
Core fucosylation	China	88,18	94,62	95,44	95,26	96,14	98,08
	Croatia	68,12	87,45	89,86	89,12	91,72	96,01
	Estonia	90,59	95,67	96,38	96,18	96,92	99,13
	Scotland	74	95,28	96,05	95,83	96,64	98,17
	England	81,95	94,74	95,59	95,36	96,28	98,14

Supplementary Table 4. Derived glycan traits in five populations used for HILIC-UPLC analysis of IgG glycosylation.

In table are given: analysed population, glycan trait parameters (minimum, maximum, median, mean, 1<sup>st</sup> and 3<sup>rd</sup> quartile).

Supplementary Table 5. Linear mixed model in five populations with age and sex defined as fixed effects and country of residence as a random effect.

Derived glycan trait	Percent of glycan trait variability explained by country of residence (%)	Percent of glycan trait variability explained by age (%)	Percent of glycan trait variability explained by sex (%)	Country of residence <i>P</i> value
Agalactosylation	14.4	30.9	0.8	$6.6 \times 10^{-194}$
Monogalactosylation	39.9	0.0	0.2	$< 6 \times 10^{-350}$
Digalactosylation	19.5	30.2	0.7	$1.1 \times 10^{-301}$
Bisecting GlcNAc	6.3	20.1	0.1	$6.7 \times 10^{-104}$
Sialylation	42.5	11.9	0.2	< 6 × 10 <sup>-350</sup>
Core fucosylation	57.5	0.1	0.0	< 6 × 10 <sup>-350</sup>

Displayed values represent percentage (%) glycan trait variability explained by age, sex and country of residence, with country of residence likelihood-ratio test *P* value.

Population	Country of residence	Cohort abbreviation	Min.	Q1	Median	Mean	Q3	Max.	F	Μ
Evenk minority	China	Evenk	10	22	29	33	41	85	29	58
General population of China (Han)	China	China	20	26	44	40	51	60	58	42
Kazak minority	China	ChiKaz	21	33	45	44	56	78	52	45
Kyrgyz minority	China	ChiKrz	22	55	65	62	70	92	56	41
Uyghur minority	China	ChiUyg	8	38	49	47	59	85	63	36
Yakut minority	Russia	Yakut	18	34	42	44	54	72	72	28
General population of Croatia	Croatia	Croatia	18	38	49	50	62	81	24	73
Roma minority	Croatia	Roma	18	28	37	38	42	79	48	51
General population of Germany	Germany	Germany	32	43	47	49	57	70	30	67
General population of Italy	Italy	Italy	24	34	46	47	58	86	48	41
General population of Kosovo	Kosovo	Kosovo	21	33	46	44	57	62	60	40
General population of Papua New Guinea	Papua New Guinea	NewGui	3	8	12	18	26	48	46	37
General population of Russia	Russia	Russia	9	17	20	23	26	43	62	38
Kazak minority	Russia	RuKaz	21	34	42	43	53	63	48	50
Tatar minority	Russia	RuTar	18	23	31	31	36	48	57	42
Yakut minority	Russia	RuYak	20	37	47	47	56	75	68	13
General population of Sweden Uninfected HIV	Sweden	Sweden	22	33	44	42	51	64	43	54
cohort participants from Thailand	Thailand	Thailand	18	28	32	33	36	49	49	50
General population of Trinidad and Tobago	Trinidad and Tobago	TriTob	22	40	53	50	59	77	81	15
General population of Turkey	Turkey	Turkey	16	48	59	57	67	79	38	62
General population of Uganda	Uganda	Uganda	17	29	33	33	37	47	54	44
General population of England (SABRE cohort)	England	SabEng	59	63	67	68	72	77	26	72
General population of England (TwinsUK cohort)	England	TwinsUK	21	33	46	46	57	70	55	42
British Indians (SABRE cohort)	England	SabInd	60	65	69	69	73	83	22	76
British Jamaicans (SABRE cohort)	England	SabJam	59	66	69	69	73	81	56	40
Population of Orkney Islands	Scotland	Orkney	21	33	46	45	56	70	52	26
Population of Shetland Islands	Scotland	Shetland	21	34	46	45	56	69	50	49

### Supplementary Table 6. Demographic characteristics of 27 populations used for IgG Fc glycosylation analysis.

In table are given: country of residence of participants, abbreviation of analysed cohort, age parameters (minimum, maximum, median, mean, 1<sup>st</sup> and 3<sup>rd</sup> quartile) and sex parameters (number of female and male participants).

Please browse Full Text version to see the data of Supplementary Tables 7–10.

Supplementary Table 7. Derived glycan traits in 27 populations used for IgG1 Fc glycopeptide analysis.

Supplementary Table 8. Derived glycan traits in 27 populations used for IgG2 Fc glycopeptide analysis.

Supplementary Table 9. Derived glycan traits in 27 populations used for IgG4 Fc glycopeptide analysis.

Supplementary Table 10. Correlations of IgG Fc derived glycan traits with participant's country of residence development indicators.

# Supplementary Table 11. Health-related Sustainable Development Goals (SDG) indicators used for assessment of country development level [65]. Development indicator and short descriptions are given.

Health-related SDG indicator	Definition
SDG	Overall health-related SDG index (health-related SDG indicators included)
MDG	Overall health-related MDX index (Health-related SDG indicators included in the
	Millennium Development Goals)
non-MDG	Health-related SDG indicators not included in the Millennium Development Goals
Adolescent birth rate	Birth rates for women aged 10–14 years and women aged 15–19 years, number of livebirths per 1000 women aged 10–14 years and women aged 15–19 years
Air pollution mortality	Age-standardised death rate attributable to household air pollution and ambient air pollution per 100 000 population
Alcohol	Risk-weighted prevalence of alcohol consumption, as measured by the SEV for alcohol use %
Disaster	Age-standardised death rate due to exposure to forces of nature, per 100 000 population
Family planning need met, modern	Proportion of women of reproductive age (15-49 years) who have their need for family
contraception	planning satisfied with modern methods, % women aged 15-49 years
Hepatitis B	Age-standardised rate of hepatitis B incidence, per 100 000 population
HIV	Age-standardised rate of new HIV infections, per 1000 population
Household air pollution	Risk-weighted prevalence of household air pollution, as measured by the SEV for household air pollution, %
Hygiene	Risk-weighted prevalence of populations with unsafe hygiene (no handwashing with soap), as measured by the SEV for unsafe hygiene, %
Intimate partner violence	Age-standardised prevalence of women aged 15 years and older who experienced intimate partner violence, %women aged 15 years and older
Malaria	Age-standardised rate of malaria cases, per 1000 population
Maternal mortality ratio	Maternal deaths per 100 000 livebirths
Mean PM 2.5	Population-weighted mean levels of PM2.5, µg/m <sup>3</sup>
NCDs	Age-standardised death rate due to cardiovascular disease, cancer, diabetes, and chronic respiratory disease in populations aged 30 - 70 years, per 100 000 population
Neglected tropical diseases Neonatal mortality	Age-standardised prevalence of neglected tropical diseases, per 100 000 population Probability of dying during the first 28 days of life per 1000 livebirths
Occupational risk burden	Age-standardised all-cause DAILY rate attributable to occupational risks, per 100 000 population
Overweight	Prevalence of overweight in children aged 2 - 4 years, %
Poisons	Age-standardised death rate due to unintentional poisonings, per 100 000 population
Road injuries	Age-standardised death rate due to road traffic injuries, per 100 000 population
Sanitation	Risk-weighted prevalence of populations using unsafe or unimproved sanitation, as measured by the SEV for unsafe sanitation, %
Skilled birth attendance	Proportion of births attended by skilled health personnel (doctors, nurses, midwives, or country-specific medical staff [e.g., clinical officers]), %
Smoking	Age-standardised prevalence of daily smoking in populations aged 10 years and older, % population aged 10 years and older
Stunting	Prevalence of stunting in achieving, by 2025, the internationally agreed targets on children under age 5 years, %
Suicide	Age-standardised death rate due to self-harm, per 100 000 population
Tuberculosis	Age-standardised rate of new and relapsed tuberculosis cases, per 1000 population
Under-5 mortality Universal health coverage tracer	Probability of dying before age 5 years per 1000 livebirths Coverage of universal health coverage tracer interventions for prevention and treatment services, %
Violence	Age-standardised death rate due to interpersonal violence, per 100 000 population
War	Age-standardised death rate due to interpersonal violence, per 100 000 population Age-standardised death rate due to collective violence and legal intervention, per 100 000 population
WaSH mortality	Age-standardised death rate attributable to unsafe WaSH, per 100 000 population
Wasting	Prevalence of wasting in children under age 5 years, %
-	Risk-weighted prevalence of populations using unsafe or unimproved water sources, as
Water	measured by the SEV for unsafe water, %

Supplementary Table 12. United Nation's Human Development Index (HDI) indicators used for assessment of country development level [66].

HDI indicator	Definition
HDI index	Composite measure of three life dimensions: life expectancy, per capita income and
	education
Health index	Life expectancy at birth in 2014; expressed as an index using a minimum value of 20
	years and a maximum value of 85 years
Life expectancy at birth	Number of years a new-born infant could expect to live if prevailing patterns of age- specific mortality rates at the time of birth stay the same throughout the infant's life
Education index	Education index is an average of mean years of schooling (of adults) and expected years
	of schooling (of children) in 2014, both expressed as an index obtained by scaling with
	the corresponding maxima
GDP	Gross domestic product (GDP) per capita in 2013
Life expectancy - M	Life expectancy at birth, male (years)
Life expectancy - F	Life expectancy at birth, female (years)
Water (UN)	Accessibility of drinkable tap water
Sanitation (UN)	Accessibility of advanced sanitation

Development indicator and short descriptions are given.

	China	Thailand	Sweden	Germany	y England	Scotland	Croatia	Italy	Kosovo	Russia	Turkey	Uganda	Trinidad	Papua
SDG index	60	56	85	80	82	82	70	78	65	54	58	31	67	36
Disaster	39	29	100	100	100	100	100	61	40	57	33	53	100	32
Stunting	87	85	100	100	100	100	91	100	91	85	86	55	95	51
Wasting	91	84	100	100	100	100	88	100	87	90	96	82	87	86
Overweight	62	71	51	47	64	64	46	39	65	46	65	82	81	71
MMR	62	61	79	71	70	70	71	79	68	61	64	28	46	22
SBA	97	99	100	100	99	99	99	99	99	99	94	68	100	65
Under-5 mort	66	81	94	89	84	84	85	91	75	72	61	32	58	42
NN mort	69	80	94	91	85	85	84	90	76	75	59	34	51	47
HIV	46	34	65	57	51	51	69	54	57	32	64	15	35	35
Tuberculosis	45	45	82	86	74	74	69	87	70	41	69	29	62	48
Malaria	94	26	100	100	100	100	100	100	100	100	100	5	100	6
Hepatitis B	40	33	85	85	85	85	66	82	66	49	43	33	67	21
NTDs	89	87	100	100	100	100	100	100	100	99	97	85	98	54
NCDs	58	61	87	77	78	78	62	85	54	41	73	46	47	19
Suicide	59	42	51	55	64	64	47	71	44	21	81	43	46	42
Alcohol	74	74	57	54	57	57	54	68	59	7	90	58	65	87
Road injuries	49	36	94	88	94	94	72	75	69	53	66	35	55	37
FP need met	86	66	91	92	95	95	34	86	37	75	70	41	76	47
Adol birth rate	69	54	84	86	73	73	80	87	70	67	61	24	60	44
UHC Tracer	81	69	99	96	100	100	84	97	84	85	82	69	93	45
Air poll mort	48	61	96	83	83	83	68	83	58	62	71	33	74	28
WaSH mort	75	49	87	84	77	77	88	96	88	79	76	22	64	21
Poisons	50	69	71	94	75	75	84	81	73	47	80	37	71	44
Smoking	52	60	75	46	55	55	32	52	43	41	47	87	68	36
IPV	96	57	80	70	80	80	91	66	82	64	53	18	73	69
Water	500	34	100	100	100	100	81	100	74	86	29	26	47	14
Sanitation	66	98	100	100	100	100	97	100	85	79	87	20	90	20
Hygiene	38	46	95	89	93	93	43	86	43	69	28	3	53	16
HH air poll	79	88	100	100	100	100	94	100	78	98	98	2	100	55
Occ risk burden	43	54	81	71	74	74	63	72	60	67	57	31	73	9
Mean PM 2.5	25	46	81	62	65	65	51	53	51	58	37	24	62	62
Violence	69	34	74	81	86	86	72	77	55	25	58	39	19	36
War	100	100	100	100	100	100	100	100	100	31	19	100	100	100
MDG index	70	63	94	92	90	90	80	92	76	75	67	33	69	33
Non-MDG index	55	54	80	73	78	78	64	70	60	46	54	29	67	37
HDI index	73	73	91	92	91	91	82	87	77	80	76	48	77	51
Life exp	76	74	82	81	81	81	77	83	75	70	75	59	70	63
Life exp F	78	78	84	83	83	83	81	86	78	76	79	61	74	65
Life exp M	75	71	81	79	79	79	74	81	72	65	72	57	67	61
GDP	11525	13932	43741	43207	37017	37017	20063	34167	12893	23564	18660	1368	29469	2458

### Supplementary Table 13. Development level of 14 countries expressed through 45 indicators.

Education index	61	62	84	89	89	89	78	78	75	81	66	45	71	41
Health Index	86	84	96	94	93	93	88	97	85	77	85	59	78	66
Water (UN)	96	98	100	100	100	100	100	100	99	97	100	79	95	40
Sanitation (UN)	77	93	99	99	99	99	97	100	96	72	95	19	92	19

Higher indicator value suggests better conditions impacting on human well-being in a given country. Indicator descriptions are given in Supplementary Tables 11 and 12.

\*MMR = maternal mortality ratio; SBA = skilled birth attendance; Under-5 mort = Under-5 mortality; NN mort = neonatal mortality; NTDs = neglected tropical diseases; NCDs = non-communicable diseases; FP need met = family planning need met, modern contraception; Adol birth rate = adolescent birth rate; UHC = universal health coverage; Air poll mort = air pollution mortality; WaSH Mort = water, sanitation, and hygiene mortality; IPV = intimate partner violence; HH air poll = household air pollution; MDG index = Millennium Development Goals Index; non-MDG index = health-related Sustainable Development Goals not included in MDG; HDI = Human Development Index; Life exp = Life expectancy at birth; Life exp F = Life expectancy – F; Life exp M = Life expectancy – M.

Please browse Full Text version to see the data of Supplementary Table 14.

Supplementary Table 14. Correlation between used development indicators.

Glycan		IgG1 glycop	oeptide m/z <sup>3</sup>	IgG2&3 gl		IgG4glycop	eptide m/z <sup>5</sup>	Glycan trait description	Glycan trait calculation <sup>6</sup>		
trait <sup>1</sup>		[M+2H] <sup>2+</sup>	[M+3H] <sup>3+</sup>	[M+2H] <sup>2+</sup>	[M+3H] <sup>3+</sup>	[M+2H] <sup>2+</sup>	[M+3H] <sup>3+</sup>		ory can brane carearation		
G0F		1317,527	878,687	1301,532	868,024	1309,529	873,356	Fraction of FA2 glycan in total subclass Fc glycans	G0F/total subclass Fc glycans*100		
G1F	<b>-</b> -	1398,553	932,705	1382,558	922,042	1390,556	927,373	Fraction of FA2G1 glycan in total subclass Fc glycans	G1F/total subclass Fc glycans*100		
G2F		1479,58	986,722	1463,585	976,059	1471,582	981,391	Fraction of FA2G2 glycan in total subclass Fc glycans	G2F/total subclass Fc glycans*100		
G0FN		1419,067	946,38	1403,072	935,717	1411,069	941,049	Fraction of FA2B glycan in total subclass Fc glycans	G0FN/total subclass Fc glycans*100		
G1FN	•	1500,093	1000,398	1484,098	989,735	1492,096	995,066	Fraction of FA2BG1 glycan in total subclass Fc glycans	glycans*100		
G2FN		1581,119	1054,416	1565,125	1043,752	1573,122	1049,084	Fraction of FA2BG2 glycan in total subclass Fc glycans	glycans*100		
G1FS1	◆ <mark>●</mark> {	1544,101	1029,737	1528,106	1019,073	1536,104	1024,405	Fraction of FA2G1S1 glycan in total subclass Fc glycans	glycans*100		
G2FS1	+-{ <mark>•==•</mark> →==	1625,127	1083,754	1609,133	1073,091	1617,13	1078,423	Fraction of FA2G2S1 glycan in total subclass Fc glycans	glycans*100		
G1FNS1	••	1645,641	1097,430	1629,646	1086,767	1637,643	1092,098	Fraction of FA2BG1S1 glycan in total subclass Fc glycans	G1FNS1/total subclass Fc glycans*100		
G2FNS1		1726,667	1151,447	1710,672	1140,784	1718,67	1146,116	Fraction of FA2BG2S1 glycan in total subclass Fc glycans	G2FNS1/total subclass Fc glycans*100		
G0	10 10	1244,498	830,001	1228,503	819,338	1236,501	824,67	Fraction of A2 glycan in total subclass Fc glycans	G0/total subclass Fc glycans*100		
G1	<b>○</b> -{ <b>■</b> - <b>0</b> - <b>■</b> - <b>■</b>	1325,524	884,019	1309,529	873,356	1317,527	878,687	Fraction of A2G1 glycan in total subclass Fc glycans	glycans*100		
G2	080 080 080	1406,551	938,036	1390,556	927,373	1398,553	932,705	Fraction of A2G2 glycan in total subclass Fc glycans	glycans*100		
G0N		1346,038	897,694	1330,043	887,031	1338,04	892,363	Fraction of A2B glycan in total subclass Fc glycans	G0N/total subclass Fc glycans*100		
G1N	•	1427,064	951,712	1411,069	941,049	1419,067	946,38	Fraction of A2BG1 glycan in total subclass Fc glycans	G1N/total subclass Fc glycans*100		
G2N		1508,090	1005,730	1492,096	995,066	1500,093	1000,398	Fraction of A2BG2 glycan in total subclass Fc glycans	G2N/total subclass Fc glycans*100		
G1S1	┿╍┤ <mark>┋╺</mark> ⋟ <b>⋼</b> ∎	1471,072	981,051	1455,077	970,387	1463,075	975,719	Fraction of A2G1S1 glycan in total subclass Fc glycans	G1S1/total subclass Fc glycans*100		
G2S1	◆-{ <mark>●-■-●</mark> -■-■	1552,098	1035,068	1536,104	1024,405	1544,101	1029,737	Fraction of A2G2S1 glycan in total subclass Fc glycans	G2S1/total subclass Fc glycans*100		
G1NS1		1572,612	1048,744	1556,617	1038,081	1564,614	1043,412	Fraction of A2BG1S1 glycan in total subclass Fc glycans	glycans*100		
G2NS1	+	1653,638	1102,761	1637,643	1092,098	1645,641	1097,43	Fraction of A2BG2S1 glycan in total subclass Fc glycans	G2NS1/total subclass Fc glycans*100		

# Supplementary Table 15. Description of directly measured subclass-specific Fc IgG glycan traits measured by LC-MS with mass list.

<sup>1</sup>Glycan composition: N (N-acetylglucosamine), F (fucose), G (galactose) and S (N-acetylneuraminic acid) followed by a number representing the number and type of monosaccharides attached to A2 glycan.

<sup>2</sup>Glycan structures are drawn in GlycoWorkbench version 2. blue square = N-acetylglucosamine, red triangle = fucose, green circle = mannose, yellow circle = galactose, purple diamond = N-acetylneuraminic acid.

<sup>3</sup>IgG1 tryptic peptide sequence carrying glycan: E293EQYNSTYR301

<sup>4</sup>IgG4 tryptic peptide sequence carrying glycan: E293EQFNSTFR301

<sup>5</sup>IgG2&3 tryptic peptide sequence carrying glycan: E293EQFNSTYR301

<sup>6</sup>total subclass Fc glycans = sum of all 20 glycopeptides in one IgG subclass

Supplementary Table 16. Description of derived subclass-specific Fc IgG glycan traits measured by LC-MS with mass list.

Derived glycan trait	Derived trait description	Derived trait calculation				
Core fucosylation	Fraction of structures containing core fucose in subclass	G0F+G1F+G2F+G0FN+G1FN+G2FN+G1F				
	specific Fc glycans	S1+G2FS1+G1FNS1+G2FNS1				
Bisecting GlcNAc	Fraction of structures containing bisecting GlcNAc in	G0FN+G1FN+G2FN+G1FNS1+G2FNS1+				
	subclass specific Fc glycans	G0N+G1N+G2N+G1NS1+G2NS1				
Agalactosylation	Fraction of agalactosylated structures in subclass specific Fc glycans	G0+G0F+G0N+G0FN				
Monogalactosylation	Fraction of structures containing one galactose in subclass	G1F+G1FN+G1FS1+G1FNS1+G1+G1N+G				
	specific Fc glycans	1S1+G1NS1				
Digalactosylation	Fraction of structures containing two galactoses in subclass	G2F+G2FN+G2FS1+G2FNS1+G2+G2N+G				
	specific Fc glycans	2S1+G2NS1				
Sialylation	Fraction of structures containing sialic acid in subclass	G1FS1+G2FS1+G1FNS1+G2FNS1+G1S1+				
	specific Fc glycans	G2S1+G1NS1+G2NS1				

#### Supplementary Table 17. Correlations between derived glycan traits measured by HILIC-UPLC.

	Agalactosylation	Monogalactosylation	Digalactosylation	<b>Bisecting GlcNAc</b>	Sialylation	Core fucosylation
Agalactosylation	1,00	-0,23	-0,89	0,38	-0,70	0,17
Monogalactosylation	-0,23	1,00	0,21	-0,07	-0,41	0,56
Digalactosylation	-0,89	0,21	1,00	-0,39	0,43	0,04
Bisecting GlcNAc	0,38	-0,07	-0,39	1,00	-0,23	-0,09
Sialylation	-0,70	-0,41	0,43	-0,23	1,00	-0,63
Core fucosylation	0,17	0,56	0,04	-0,09	-0,63	1,00

Supplementary Table 18. Correlations between derived subclass-specific Fc IgG glycan traits measured by LC-MS.

	IgG1	IgG1_N	lgG1	Ig	li	lgG2_	IgG2_N	IgG2_	lg	Į	lgG4	IgG4_N	IgG4_	Ig	<del></del>
	_Agalactosylation	Monogalactosylation	_Digalactosylation	IgG1_Sialylation	IgG1_Bisecting	_Agalactosylation	_Monogalactosylation	_Digalactosylation	IgG2_Sialylation	IgG2_Bisecting	_Agalactosylation	_Monogalactosylation	_Digalactosylation	IgG4_Sialylation	IgG4_Bisecting
IgG1_Agalactosylation	1,00	-0,64	-0,90	-0,62	0,26	0,81	-0,63	-0,76	-0,57	0,21	0,67	-0,39	-0,62	-0,47	0,22
IgG1_Monogalactosylation	-0,64	1,00	0,47	-0,09	0,00	-0,42	0,65	0,29	0,08	-0,02	-0,33	0,50	0,22	0,02	-0,06
IgG1_Digalactosylation	-0,90	0,47	1,00	0,46	-0,30	-0,81	0,56	0,87	0,53	-0,26	-0,62	0,31	0,67	0,40	-0,23
IgG1_Sialylation	-0,62	-0,09	0,46	1,00	-0,26	-0,51	0,15	0,47	0,62	-0,17	-0,50	0,04	0,44	0,60	-0,19
IgG1_Bisecting	0,26	0,00	-0,30	-0,26	1,00	0,28	-0,15	-0,31	-0,23	0,84	0,28	-0,12	-0,31	-0,19	0,60
IgG2_Agalactosylation	0,81	-0,42	-0,81	-0,51	0,28	1,00	-0,72	-0,93	-0,77	0,28	0,61	-0,30	-0,60	-0,46	0,24
IgG2_Monogalactosylation	-0,63	0,65	0,56	0,15	-0,15	-0,72	1,00	0,56	0,20	-0,17	-0,44	0,41	0,39	0,18	-0,12
IgG2_Digalactosylation	-0,76	0,29	0,87	0,47	-0,31	-0,93	0,56	1,00	0,68	-0,28	-0,58	0,23	0,64	0,43	-0,23
IgG2_Sialylation	-0,57	0,08	0,53	0,62	-0,23	-0,77	0,20	0,68	1,00	-0,22	-0,46	0,10	0,42	0,50	-0,23
IgG2_Bisecting	0,21	-0,02	-0,26	-0,17	0,84	0,28	-0,17	-0,28	-0,22	1,00	0,23	-0,11	-0,25	-0,15	0,58
IgG4_Agalactosylation	0,67	-0,33	-0,62	-0,50	0,28	0,61	-0,44	-0,58	-0,46	0,23	1,00	-0,56	-0,91	-0,75	0,25
IgG4_Monogalactosylation	-0,39	0,50	0,31	0,04	-0,12	-0,30	0,41	0,23	0,10	-0,11	-0,56	1,00	0,34	-0,06	-0,39
IgG4_Digalactosylation	-0,62	0,22	0,67	0,44	-0,31	-0,60	0,39	0,64	0,42	-0,25	-0,91	0,34	1,00	0,69	-0,19
IgG4_Sialylation	-0,47	0,02	0,40	0,60	-0,19	-0,46	0,18	0,43	0,50	-0,15	-0,75	-0,06	0,69	1,00	0,00
IgG4_Bisecting	0,22	-0,06	-0,23	-0,19	0,60	0,24	-0,12	-0,23	-0,23	0,58	0,25	-0,39	-0,19	0,00	1,00