



Multipathogen Analysis of IgA and IgG Antigen Specificity for Selected Pathogens in Milk Produced by Women From Diverse Geographical Regions: The INSPIRE Study

OPEN ACCESS

Edited by:

José Roberto Mineo, Federal University of Uberlandia, Brazil

Reviewed by:

Bharani Srinivasan, Cedars Sinai Medical Center, United States Marisa Mariel Fernandez, Institute of Studies on Humoral Immunity (IDEHU), Argentina

*Correspondence:

Michelle K. McGuire smcguire@uidaho.edu Joseph J. Campo jcampo@antigendiscovery.com

Specialty section:

This article was submitted to Microbial Immunology, a section of the journal Frontiers in Immunology

Received: 06 October 2020 Accepted: 23 December 2020 Published: 11 February 2021

Citation:

McGuire MK, Randall AZ, Seppo AE, Järvinen KM, Meehan CL, Gindola D, Williams JE, Sellen DW, Kamau-Mbuthia EW, Kamundia EW, Mbugua S, Moore SE, Prentice AM, Foster JA, Otoo GE, Rodríguez JM, Pareja RG, Bode L, McGuire MA and Campo JJ (2021) Multipathogen Analysis of IgA and IgG Antigen Specificity for Selected Pathogens in Milk Produced by Women From Diverse Geographical Regions: The INSPIRE Study. Front. Immunol. 11:614372. doi: 10.3389/fimmu.2020.614372 Michelle K. McGuire^{1*}, Arlo Z. Randall², Antti E. Seppo³, Kirsi M. Järvinen³, Courtney L. Meehan⁴, Debela Gindola⁵, Janet E. Williams⁶, Daniel W. Sellen⁷, Elizabeth W. Kamau-Mbuthia⁸, Egidioh W. Kamundia⁸, Samwel Mbugua⁸, Sophie E. Moore^{9,10}, Andrew M. Prentice¹⁰, James A. Foster¹¹, Gloria E. Otoo¹², Juan M. Rodríguez¹³, Rossina G. Pareja¹⁴, Lars Bode^{15,16}, Mark A. McGuire⁶ and Joseph J. Campo^{2*}

¹ Margaret Ritchie School of Family and Consumer Sciences, University of Idaho, Moscow, ID, United States, ² Antigen Discovery Incorporated, Irvine, CA, United States, ³ Department of Pediatrics, University of Rochester, Rochester, NY, United States, ⁴ Department of Anthropology, Washington State University, Pullman, WA, United States, ⁵ Department of Anthropology, Hawassa University, Awasa, Ethiopia, ⁶ Department of Animal and Veterinary Science, University of Idaho, Moscow, ID, United States, ⁷ Dalla Lana School of Public Health, University of Toronto, Toronto, ON, Canada, ⁸ Department of Human Nutrition, Egerton University, Nakuru, Kenya, ⁹ Department of Women and Children's Health, King's College London, London, United Kingdom, ¹⁰ MRC Unit, The Gambia at the London School of Hygiene and Tropical Medicine, Banjul, Gambia, ¹¹ Department of Biological Sciences, University of Idaho, Moscow, ID, United States, ¹² Department of Nutrition and Food Science, University of Ghana, Accra, Ghana, ¹³ Department of Nutrition and Food Science, Complutense University of Madrid, Madrid, Spain, ¹⁴ Nutrition Research Institute, Lima, Peru, ¹⁵ Larsson-Rosenquist Foundation Mother-Milk-Infant Center of Research Excellence, University of California, San Diego, La Jolla, CA, United States, ¹⁶ Department of Pediatrics, University of California, San Diego, La Jolla, CA, United States

Breastfeeding provides defense against infectious disease during early life. The mechanisms underlying this protection are complex but likely include the vast array of immune cells and components, such as immunoglobulins, in milk. Simply characterizing the concentrations of these bioactives, however, provides only limited information regarding their potential relationships with disease risk in the recipient infant. Rather, understanding pathogen and antigen specificity profiles of milk-borne immunoglobulins might lead to a more complete understanding of how maternal immunity impacts infant health and wellbeing. Milk produced by women living in 11 geographically dispersed populations was applied to a protein microarray containing antigens from 16 pathogens, including diarrheagenic E. coli, Shigella spp., Salmonella enterica serovar Typhi, Staphylococcus aureus, Streptococcus pneumoniae, Mycobacterium tuberculosis and other pathogens of global health concern, and specific IgA and IgG binding was measured. Our analysis identified novel disease-specific antigen responses and suggests that some IgA and IgG responses vary substantially within and among populations. Patterns of antibody reactivity analyzed by principal component analysis and differential reactivity analysis were associated with either lower-to-middle-income

countries (LMICs) or high-income countries (HICs). Antibody levels were generally higher in LMICs than HICs, particularly for *Shigella* and diarrheagenic *E. coli* antigens, although sets of *S. aureus*, *S. pneumoniae*, and some *M. tuberculosis* antigens were more reactive in HICs. Differential responses were typically specific to canonical immunodominant antigens, but a set of nondifferential but highly reactive antibodies were specific to antigens possibly universally recognized by antibodies in human milk. This approach provides a promising means to understand how breastfeeding and human milk protect (or do not protect) infants from environmentally relevant pathogens. Furthermore, this approach might lead to interventions to boost population-specific immunity in at-risk breastfeeding mothers and their infants.

Keywords: human milk, immunoglobulins, IgA, IgG, pathogen, protein array, breastmilk, breastfeeding

INTRODUCTION

Human milk is the gold standard for infant nutrition, particularly during the first 6 months of life (1, 2). Although geography, socioeconomic factors, resources, and myriad other factors modify benefits of breastfeeding, infants who are fed human milk have lower risks for many serious childhood illnesses including infectious diarrheal and respiratory diseases (3, 4). Breastfeeding is also associated with lower risks of long-term outcomes such as obesity, diabetes, and cardiovascular disease, particularly in preterm infants (5–7). How breastfeeding protects against these diseases and conditions is multifactorial, but human milk's complex milieu of nutrients, cells, and other biologically active factors likely plays a major role.

For instance, human milk contains complex carbohydrates (human milk oligosaccharides, HMOs) thought to shape the infant's gastrointestinal (GI) microbial community structures in such a way that harmful taxa are excluded and/or removed (8,9). Human milk also contains a battery of biologically-active compounds such as fatty acids, lactoferrin, haptocorrin, and α_1 -antitrypsin thought to decrease the risk of infant infection (10, 11). Human milk also harbors a unique and rich bacterial community, which may function in concert with its array of prebiotic and antimicrobial components to shape the recipient infant's GI and respiratory microbiomes (12-16). Maternally derived immune factors and immune cells, many of which have been primed to fend off the pathogens endemic to an infant's environment, are most certainly important in this regard (17, 18). These factors include aspects of both innate and acquired immune systems, such as neutrophils, B and T cells, natural killer cells, cytokines, chemokines, complement system components, and immunoglobulins. The immunoglobulins, most of which are present as secretory immunoglobulin A (IgA), are thought to be directed at pathogens with which the mother has had contact, representing a form of dynamic immunological memory (19).

Whereas only a small proportion of the IgA consumed by breastfeeding infants is absorbed, its function is thought to be a first-line defense against foreign antigens present within the newborn's intestine (20). For instance, IgA in colostrum has been shown to react to enteropathogenic *Escherichia coli* (EPEC) antigens in the feces of breastfed infants, likely important to the protective effect of breastfeeding on diarrheagenic E. coli strains (21, 22). In another study, the concentration of anti-Giardia lamblia IgA in human milk consumed by infected but asymptomatic infants living in a low-income Mexico City neighborhood, was higher than that of human milk consumed by infected and symptomatic infants living in the same area (23). This suggests a protective effect of these antibodies, at least in terms of symptomatology. Other studies have demonstrated relatively high levels of IgA to Shigella plasmid-coded virulence antigens in milk produced by women currently living in areas with both high- and low-risk for Shigella infection (Mexico City and Houston, respectively) (24, 25). They suggested that the frequency and persistence of these antibodies targeted toward Shigella in the milk of Houston women point to the possibility that a woman's "memory and drive for secretion of these antibodies is extremely long lived" - a conclusion also reached by Ciardelli and colleagues who studied E. coli-specific IgA in milk produced by women who immigrated from high-risk regions but who currently lived in a low-risk region of northern Italy (26). Hayani et al. also reported that concentration of anti-Shigella IgA to virulence plasmid-associated antigens in human milk was 8-fold higher in mothers of healthy (yet high-risk) infants compared to those mothers with infants living in the same region but developing diarrhea (27). Collectively, these and other studies point to the likely importance of specific antibodies in milk potentially customized toward protecting a breastfed infant from historically endemic pathogens. However, aside from a few studies designed to characterize immunoglobulin specificity using limited antigenic targets, little is known about the complex immunoglobulin profiles found in human milk in terms of relative specificities to the multiple pathogens encountered by nursing mothers and their recipient infants.

One method of gaining insight as to the specificity of milkborne immunoglobulins is the use of high-throughput protein arrays featuring multiple antigens associated with selected pathogens. This approach has been used with serum to characterize specific immune responses to selected pathogens and their associated antigens in humans, agricultural animals, and preclinical models (28–30). The method, however, has not been used to characterize the complex immune specificity to multiple pathogens in any sample type, nor has it been used for human milk. Being able to describe the specific and complex immunoglobulin milieu of a woman's milk will offer useful insight as to how breastfeeding protects infants living in highrisk environments from illness.

Here, we first explored whether high-throughput, protein array methodologies used previously with other biological specimens could be modified to characterize complex immune specificities of IgA and IgG in milk. We then expanded the method to simultaneously consider multiple pathogens rather than a single pathogen. In particular, we were interested in pathogens (and groups, thereof) known to cause neonatal diarrheal and respiratory diseases in the world's poorest regions. These included EPEC, enterotoxigenic E. coli (ETEC), enteroaggregative E. coli (EAEC), Shigella spp., Salmonella enterica serovar Typhi, Staphylococcus aureus, Streptococcus pneumoniae, and Mycobacterium tuberculosis. Having determined that the methods could indeed be used for the milk matrix (see Results), we conducted exploratory analyses to compare and contrast relative IgA and IgG reactivities to selected antigens known to reflect enhanced responsivity in other biological sample types. Importantly, milk samples analyzed in this study were obtained from healthy, breastfeeding women living in 11 locations around the world. Previous analysis of these samples indicated that concentrations of immunoglobulins, cytokines, and chemokines varied among cohorts, making the samples particularly relevant to the present proof-of-concept study (31). Our overarching hypotheses were that IgA and IgG specificity would vary by pathogen and cohort and be generally higher in low-to-middle income countries (LMIC) compared to high-income countries (HIC) as classified by the World Health Organization (32).

MATERIAL AND METHODS

Experimental Design, Subjects, and Ethics Approvals

This investigation was conducted as part of the "INSPIRE" study designed to characterize and compare complex carbohydrate and microbial community structure in milk produced by relatively healthy women around the globe. A detailed description of the study as well as initial findings and participant characteristics have been published elsewhere (16, 31, 33). Briefly, women had to be healthy; breastfeeding or pumping at least five times daily; self-reported-healthy and nursing relatively healthy infants; ≥ 18 years of age; and generally between 1 and 3 months postpartum. Our 11 cohorts were drawn from eight countries: rural and urban Ethiopia (ETR and ETU, respectively), rural and urban The Gambia (GBR and GBU, respectively), Ghana (GN), Kenya (KE), Peru (PE), Spain (SP), Sweden (SW) and the United States [Washington (USW) and California (USC)]. Ethics approvals were obtained for all procedures from each participating institution, with overarching approval from the Washington State University Institutional Review Board (#13264). A total of 413 women were enrolled in the study, and milk was collected from 412 of them. Here, we report data obtained from milk

collected from 404 women as follows: ETR (n = 38), ETU (n = 40), GBR (n = 40), GBU (n = 40), GN (n = 40), KE (n = 42), PE (n = 43), SP (n = 41), SW (n = 24), USC (n = 15), USW (n = 41).

Milk Collection and Preservation

In PE, SW, USC, and USW, milk was collected using an electric breast pump. In all other cohorts, milk was manually expressed. Except for those collected in ETR, samples were immediately placed on ice, aliquoted within 30 min, and frozen at -20° C. Milk collected in ETR was preserved in a 1:1 ratio with Milk Preservation Solution (Norgen Biotek, Cat. 44800, Thorold, Ontario) and frozen within 6 d. We have shown previously that this method can maintain bacterial DNA integrity in human milk held at 37°C for at least 2 weeks (34). All samples were shipped on dry ice to the University of Idaho, where they were immediately frozen at -20° C.

Optimization of Protein Array Methodology for Human Milk

Methods used to prepare the milk for protein array analysis were adapted from those of Espinosa-Martos et al (35). Briefly, after being thawed on ice and homogenized, whole milk was centrifuged for 15 min at 30,000xg at 4°C. Avoiding both the fat layer and cell pellet, the skim layer was then carefully removed. This procedure was repeated on the skim fraction, and the resultant supernatant refrozen at -20° C until it was analyzed for its immune specificity.

Selection of Antigens for Protein Arrays

The multipathogen array was designed to include approximately 80 proteins from each primary focus gastrointestinal, respiratory, and sepsis-related pathogen, as well as 5-15 proteins from secondary pathogens relevant to global health. Selection of proteins followed two approaches: 1) an empirical approach utilizing the databases from prior studies performed at Antigen Discovery, Inc. (ADI, Irvine, CA), and 2) a hypothetical approach using in silico prediction of antigenic targets and orthologues of confirmed antigenic targets already identified in ADI databases. Proteins were selected for inclusion based on seroprevalence rates and correlation with exposure to pathogens, or where limited data were available, homology with other antigens. Recombinant purified proteins were included based on commercial availability or provision through partners and collaborators. A detailed explanation of protein selection can be found in the Supplemental Information.

Proteome Microarray Construction

Proteome microarrays were fabricated as previously described using a library of partial or complete CDSs cloned into a T7 expression vector pXI that has been established previously at Antigen Discovery, Inc (36). Briefly, the clone library was created through an *in vivo* recombination cloning process with PCRamplified coding sequences, and a complementary linearized expressed vector transformed into chemically competent *E. coli* cells was amplified by PCR and cloned into the pXI vector using a high-throughput PCR recombination cloning method as described in detail elsewhere (37). All 783 clones were sequenced (Retrogen, Inc., San Diego, CA), and the results matched the correct target for all clones. Proteins were expressed using an E. coli in vitro transcription and translation (IVTT) system (Rapid Translation System, 5 Prime, Gaithersburg, MD, USA; currently provided by biotechrabbit GmbH, Cat. BR1400102, Hennigsdorf, Germany). Each expressed protein includes a 5' polyhistidine (His) epitope tag and a 3' hemagglutinin (HA) epitope tag. After expressing the proteins according to the manufacturer's instructions, translated proteins were printed onto nitrocellulose-coated glass AVID slides (Grace Bio-Labs, Inc., Bend, OR) using an OmniGrid accent robotic microarray printer (Digilabs, Inc., Marlborough, MA). Each slide contained eight nitrocellulose pads on which the full array was printed (this allowed eight samples to be probed per slide using sealed chambers that isolate the arrays). In addition to the targeted proteins, IVTT reactions without expression insert were included and spotted in replicates on each subarray of each pad. These "IVTT controls" served as a normalization factor for array-to-array variation. At approximately 1 nL deposition per spot, IVTT protein per spot was estimated to range between 0.04-0.4ng according to manufacturer guidance. No normalization was done for variation in amount of protein deposited between spots; intra-sample between-protein analysis was not planned. Microarray chip printing and protein expression were quality checked by probing random slides with anti-His and anti-HA monoclonal antibodies with fluorescent labeling. Consistency in protein deposition between slides allows for valid intersample comparisons at the protein level.

Probing Details

Milk samples were diluted 1:5 in a 1.5 mg/ml E. coli lysate solution (Antigen Discovery, Inc., Irvine, CA) in protein arraying buffer (GVS, Cat. 10485356, Sanford, ME) and incubated at room temperature for 30 min. For milk samples previously diluted in preservative solution, samples were diluted 1:2.5 in the lysate solution. Microarray slides were hydrated in arraying buffer and then probed with 250 µl of the preincubated milk samples using sealed, fitted slide chambers to avoid crosscontamination between arrays. Arrays were incubated overnight at 4°C with agitation, washed three times with Trisbuffered saline (TBS)-0.05% Tween 20 (Thermo Scientific, J77500K8, diluted 20x in molecular grade water), and incubated with Cy3-conjugated anti-human IgG diluted 1:200 in arraying buffer and biotin-conjugated anti-Human IgA diluted 1:1000 (Jackson ImmunoResearch, Cat. 709-165-098 and Cat. 109-065-011, West Grove, PA). Arrays were washed three times with TBS-0.05% Tween 20 and incubated with streptavidin-conjugated SureLight P-3 (Columbia Biosciences, Cat. D7-2212, Frederick, MD) at room temperature, protected from light. Arrays were washed 3x with TBS-0.05% Tween 20, 3x with TBS, and once with water and then air dried by being centrifuged at 1,000 x g for 4 min and left overnight in a desiccator before scanning. Probed microarrays were scanned

using a GenePix 4,300 A high-resolution microarray scanner (Molecular Devices, Sunnyvale, CA), and an image file (.tiff) was saved for each array using GenePix pro 7 software. The signals in the scanned images were quantified using Mapix software (Innopsys). All further data processing was performed in R (http://www.R-project.org). Data were normalized by first transforming raw values using the base 2 logarithm. Next, the data set was normalized to remove systematic effects by subtracting the median signal intensity of the IVTT control spots for each sample. Since the IVTT control spots carry not only the chip, sample, and batch-level systematic effects, but also antibody background reactivity to the E. coli cell-free IVTT system, this procedure normalizes the data and provides a relative measure of the specific antibody binding versus the nonspecific antibody binding to the IVTT controls. With the normalized data, a value of 0.0 means that the intensity is no different than that of the IVTT controls, a value of 1.0 indicates a doubling (2-fold) with respect to IVTT control spots, a value of 2.0 indicates 4-fold, 3.0 indicates 8-fold, etc. IgA and IgG normalized data were analyzed separately, due to independent normalized intensity scales.

Bioinformatics and Statistics

An a priori statistical analysis plan was drafted and reviewed prior to data acquisition and preprocessing. Additional details and post hoc analytical procedures are included in the Supplemental Information. Briefly, protein seropositivity was defined for each antigen as twice the sample-specific (array-level) median IVTT background, or a normalized signal of 1.0. Antibody breadth was calculated as the number of seropositive protein responses for an individual sample. IgA and IgG breadths were represented on a per-pathogen basis as antibody "breadth score," calculated as the sum of seropositive responses per pathogen divided by the total number of probes for the corresponding pathogen, i.e. the proportion of positive probes. Summary statistics included mean and median breadth scores, and 95% confidence intervals and interquartile ranges. Antibody magnitude was analyzed as the continuous normalized signal intensity data. Both breadth and magnitude were assessed for differential reactivity between the study cohorts using ANOVA. Each pair of cohorts was tested using T-tests to construct a Pvalue matrix of pairwise differences. To assess factors associated with IgA and IgG reactivity, multivariable linear regression models were fit with normalized signal intensity of individual protein responses as the dependent variables, that included the cohorts as a categorical predictor variable and the following covariables: mother's age (y), sex of the breastfeeding infant (male/female), time postpartum (d), parity (# of births), delivery method (cesarean/vaginal), body mass index (BMI) classification (under-, normal-, over-, and obese-weight), mother's height (cm), presence or absence of companion animals or agricultural animals, and household density [(# of individuals residing in the home) \div (# of bedrooms + 1); note that we added +1 to all to adjust for living/bedroom space homes without bedrooms]. All P-values were adjusted for the false discovery rate (38).

RESULTS AND DISCUSSION

Sample Dilution and Nonspecific Binding

The microarray assay was performed as a dual-labeling experiment, where the Cy3 (green) channel was used to measure IgG responses and the Cy5 (red) channel was used to measure IgA responses. This necessitated using a single sample dilution for the experiments (1:2.5 for milk with preservative and 1:5 for milk without preservative). As described previously, milk collected in rural Ethiopia was chemically preserved because there did not exist reliable electricity in this location (33). The dilution was decided upon by assessing signal-to-noise ratio of the most reactive spots and the number of reactive spots for both IgG and IgA. Due to the restriction of performing IgA and IgG assays simultaneously, the sample dilution had to be balanced to allow detection of the lower concentrations of IgG and the markedly higher concentrations of IgA (31). A greater dilution of samples could be used if there had only been interest in IgA. This technical point is raised because the obtained data showed many IgA responses across all cohorts to antigens from pathogens where there is likely a low risk of exposure. This antibody binding is in part likely cross-reactive and/or polyspecific and might be reduced with more diluted samples. This technical factor may be mitigated by the normalization procedure applied to the data, which accounts for IgA reactivity against components of the E. coli cell-free expression system. Despite the observed polyspecific binding, strong IgA responses with differential reactivity between cohorts could be observed with the assay conditions.

Antigen Down-Selection From Complete Proteomes

A primary set of pathogens (ETEC, EPEC, EAEC, Shigella spp., Salmonella enterica Typhi, Staphylococcus aureus, Streptococcus pneumoniae, and Mycobacterium tuberculosis) was selected for inclusion on the protein microarray with a target of approximately 80 proteins per pathogen. A secondary set of pathogens (*P. falciparum*, *O. volvulus*, measles virus, rubella virus, dengue virus, Zika virus, yellow fever virus, and chikungunya virus) was used in the microarray with up to 15 proteins per pathogen. Empirical data from prior experiments performed with serum assayed on full or partial proteome protein microarrays were used for selection of proteins with evidence of reactivity with antibodies and association with pathogen infection, history of exposure and protection from the pathogen (details in **Supplemental Information**).

IgA and IgG Specific to Endemic Pathogens Can Be Detected in Human Milk

Immunoglobulins specific to ETEC, *S. aureus*, and *S. enterica* Typhi were first detected in two human milk samples probed on full proteome and down-selected, single-pathogen microarrays containing cell-free *in vitro* transcription and translation (IVTT) expressed proteins. The dilution factors were optimized separately for both fresh milk samples and those stored in preservative. The numbers of reactive proteins and IgA and IgG signal levels of ETEC and Salmonella proteins on the microarrays for the two probed samples correlated with whole anti-bacteria IgA1 ELISA optical density measurements for E. coli and Salmonella typhimurium (Figure S1). S. aureus whole bacteria ELISA was not performed, but Enterococcus faecalis, Lactobacillus reuteri, Streptococcus equi, Enterobacter cloacae, and Morganella morganii ELISA were performed (prior to protein microarray experiments, unpublished data) and showed agreement with S. aureus IgA responses by protein microarray, sample JL112015 being the more reactive sample-S. aureus protein microarray IgG responses were similar between the two samples tested (Figures S1B, D). Additionally, blocking buffers with and without BSA and secreted vs. total IgA were tested. Correlations were high and CVs low in all comparisons (Figure S1E). Probing the milk samples on the multipathogen array demonstrated specific antibody binding against numerous proteins from the primary set of pathogens, and at least some reactivity against proteins from the secondary set of pathogens (Figure S2).

Distribution of IgA and IgG Profiles Varied by Pathogen and Ig Type

The effect of cohort on average normalized signals to the 10 antigens most reactive to IgA or IgG for each primary pathogen is illustrated in **Figure 1** (data provided in **Table 1**), and pairwise cohort comparisons of pathogen-specific IgA and IgG means are shown in **Tables S1A**, **B**. IgA responses tended to be widely distributed, with responses seen for most pathogens in all populations, with the exception of measles virus, rubella virus, the arboviruses, and *O. volvulus*, which had most signals at or near background levels (**Figure 1A**, **Table S1A**). For overall IgA reactivity, there was an effect of cohort for ETEC, EPEC, EAEC, *Shigella*, *S. enterica* Typhi, *S. aureus*, *S. pneumoniae*, *M. tuberculosis*, *P. falciparum*, measles virus, and Zika virus. For instance, IgA reactivity to *Shigella* was higher in Peru than in Spain ($P_{adj} < 0.001$, **Table S1A**).

Unexpectedly, IgA reactivity was observed against M. tuberculosis proteins in the U.S. and the European Union (E.U.) populations, despite low incidence of tuberculosis in these countries (2016 U.S.: 2.9 cases per 100,000; 2016 Spain 10.7 cases per 100,000; 2015 Sweden <10 cases per 100,000). These data are somewhat perplexing, because the incidence of tuberculosis is much lower in Europe and North America than Africa, with South America having intermediate rates (39, 40). There are several possible explanations for this finding. First, it is possible (but we believe unlikely) that there is a higher incidence of M. tuberculosis exposure and/or latent tuberculosis than previously thought in E.U. and U.S. women. It is currently estimated that latent tuberculosis (defined by the absence of clinical symptoms but having positive immunologic responses to the pathogen) affects one third of the global population, and like other members of the genus, M. tuberculosis can survive for long periods of time in soil and other media (41). Furthermore, there are reports from the early 1900s that M. tuberculosis can be found in the milk of infected women, and breastfeeding has long



been known to be a mode of tuberculosis transmission from mother to infant (42, 43). As such, it is possible that these high levels of reactivity indicate higher than anticipated exposure to M. tuberculosis in the U.S. and Europe. Speciating the bacterial communities in these milk samples would be needed to test this hypothesis. It is also possible that the antigens chosen to reflect *M. tuberculosis* exposure, although highly responsive to M. tuberculosis and clinical signs and symptoms of tuberculosis, are not specific to this species. Supporting this possibility are the findings by Perley and colleagues that showed antibody reactivity against M. tuberculosis in non-exposed U.S. individuals overlapping with responses in individuals that had active tuberculosis (44). It is possible that cross-reactivity of milkborne immunoglobulins to antigens shared by *M. tuberculosis* and other mycobacteria, as have been described for T-cell epitopes, represents important, albeit less specific, protection from these and other related pathogens for the recipient infant (45). It is noteworthy that the high reactivity to M. tuberculosisrelated antigens in the U.S. and European samples is probably not due to maternal or infant immunization, as tuberculosis vaccination is not currently recommended for broad use in Sweden and Spain, and was never recommended in the U.S. A final, and intriguing possibility is that immunoglobulins to M.

tuberculosis antigens and to other pathogen antigens observed in healthy women may be cross-reactivity originating from exposure to conserved epitopes in organisms of the gut microbiome, as was described again for T-cell epitopes (46). This hypothesis merits further testing by contrasting pathogen immunoglobulin responses with immunoglobulins against specific antigens in the microbiome.

Compared to IgA, IgG responses had a narrower distribution and they were more often cohort-dependent; *S. aureus* and *S. pneumoniae* IgG were broadly distributed, but *Shigella* spp. and EPEC IgG were mostly detected in Africa and Peru, and *P. falciparum* proteins were limited mainly to African countries (**Figure 1B**, **Table S1B**). For overall IgG reactivity, there was an effect of cohort for all pathogens studied. For instance, IgG reactivity to *Shigella* was higher in Peru than in Spain ($P < 1x10^{-28}$, **Table S1B**).

Distribution of IgA and IgG Breadth Scores Varied by Pathogen and Ig Type

We also calculated antibody breadth scores, a measure of the seropositivity rate (proportion positive) across all antigens for each pathogen. Overall medians and interquartile ranges of IgA and IgG breadth scores for each primary pathogen are illustrated TABLE 1 | Immunoglobulin A (IgA) breadth score and mean [SEM] reactivities to the 10 most-reactive antigens, and mean reactivities to all antigens for each of the primary pathogens included on the protein array in milk produced by women living in rural Ethiopia (ETR), urban Ethiopia (ETU), rural The Gambia (GBR), urban The Gambia (GBU), Ghana (GN), Kenya (KE), Peru (PE), Spain (SP), Sweden (SW), US-California (USC), and US-Washington (USW).

Pathogen	Sig	ETR	ETU	GBR	GBU	GN	KE	PE	SP	SW	USC	USW
ETEC												
Breadth score	***	0.21 [0.01]	0.21 [0.01]	0.16 [0.02]	0.17 [0.01]	0.19 [0.01]	0.15 [0.02]	0.24 [0.01]	0.2 [0.02]	0.21 [0.02]	0.27 [0.02]	0.2 [0.01]
Top 10 antigens	***	1.55 [0.1]	1.41 [0.08]	1.26 [0.09]	1.32 [0.09]	1.47 [0.1]	1.18 [0.09]	1.79 [0.07]	1.53 [0.1]	1.48 [0.1]	1.82 [0.15]	1.48 [0.08]
All antigens	**	0.45 [0.04]	0.48 [0.04]	0.33 [0.04]	0.38 [0.04]	0.39 [0.04]	0.31 [0.04]	0.53 [0.04]	0.43 [0.05]	0.46 [0.04]	0.59 [0.06]	0.41 [0.04]
EPEC												
Breadth score	***	0.15 [0.01]	0.17 [0.01]	0.15 [0.01]	0.16 [0.01]	0.17 [0.01]	0.14 [0.01]	0.21 [0.01]	0.13 [0.01]	0.13 [0.01]	0.17 [0.02]	0.14 [0.01]
Top 10 antigens	***	2.18 [0.12]	2.24 [0.11]	2.07 [0.1]	2.28 [0.1]	2.41 [0.12]	1.89 [0.11]	2.62 [0.09]	1.89 [0.09]	1.97 [0.17]	2.34 [0.17]	1.96 [0.12]
All antigens	***	0.24 [0.03]	0.37 [0.04]	0.24 [0.04]	0.3 [0.04]	0.32 [0.04]	0.23 [0.04]	0.43 [0.04]	0.16 [0.04]	0.21 [0.05]	0.31 [0.06]	0.17 [0.05]
EAEC												
Breadth score	***	0.1 [0.01]	0.1 [0.01]	0.07 [0.01]	0.06 [0.01]	0.09 [0.01]	0.06 [0.01]	0.12 [0.01]	0.08 [0.01]	0.11 [0.01]	0.12 [0.02]	0.09 [0.01]
Top 10 antigens	***	1.03 [0.08]	1.03 [0.06]	0.78 [0.08]	0.8 [0.06]	0.9 [0.07]	0.74 [0.06]	1.17 [0.05]	0.9 [0.09]	0.97 [0.09]	1.19 [0.15]	0.86 [0.07]
All antigens	*	0.14 [0.04]	0.19 [0.03]	0.03 [0.04]	0.04 [0.04]	0.09 [0.04]	0.06 [0.04]	0.18 [0.04]	0.07 [0.05]	0.12 [0.05]	0.22 [0.07]	0.07 [0.04]
Shigella												
Breadth score	***	0.29 [0.02]	0.29 [0.02]	0.23 [0.02]	0.26 [0.02]	0.27 [0.02]	0.19 [0.02]	0.3 [0.02]	0.19 [0.02]	0.21 [0.02]	0.24 [0.03]	0.19 [0.01]
Top 10 antigens	***	1.89 [0.1]	1.72 [0.09]	1.45 [0.09]	1.62 [0.08]	1.71 [0.1]	1.26 [0.09]	1.74 [0.08]	1.23 [0.07]	1.2 [0.09]	1.35 [0.1]	1.18 [0.07]
All antigens	***	0.71 [0.05]	0.7 [0.05]	0.55 [0.05]	0.63 [0.04]	0.65 [0.05]	0.46 [0.05]	0.7 [0.04]	0.46 [0.04]	0.49 [0.05]	0.6 [0.06]	0.46 [0.04]
S. enterica Typhi												
Breadth score	**	0.16 [0.01]	0.16 [0.01]	0.14 [0.01]	0.14 [0.01]	0.16 [0.01]	0.12 [0.01]	0.17 [0.01]	0.17 [0.01]	0.18 [0.02]	0.21 [0.02]	0.17 [0.01]
Top 10 antigens	***	1.57 [0.09]	1.52 [0.08]	1.22 [0.08]	1.3 [0.08]	1.42 [0.09]	1.12 [0.08]	1.58 [0.07]	1.54 [0.08]	1.55 [0.1]	1.72 [0.13]	1.56 [0.07]
All antigens	**	0.4 [0.03]	0.42 [0.03]	0.34 [0.04]	0.39 [0.03]	0.4 [0.03]	0.29 [0.03]	0.46 [0.03]	0.42 [0.03]	0.46 [0.04]	0.54 [0.05]	0.42 [0.03]
S. aureus												
Breadth score	***	0.2 [0.02]	0.16 [0.01]	0.12 [0.02]	0.13 [0.01]	0.15 [0.02]	0.12 [0.02]	0.18 [0.01]	0.25 [0.02]	0.22 [0.02]	0.21 [0.03]	0.23 [0.02]
Top 10 antigens	***	1.65 [0.09]	1.41 [0.08]	1.13 [0.1]	1.29 [0.07]	1.36 [0.1]	1.19 [0.08]	1.54 [0.08]	1.96 [0.1]	1.76 [0.11]	1.71 [0.12]	1.97 [0.09]
All antigens	***	0.46 [0.04]	0.39 [0.04]	0.26 [0.05]	0.31 [0.04]	0.31 [0.05]	0.23 [0.04]	0.39 [0.04]	0.55 [0.07]	0.49 [0.07]	0.47 [0.06]	0.52 [0.05]
S. pneumoniae												
Breadth score	***	0.25 [0.01]	0.27 [0.01]	0.2 [0.02]	0.21 [0.01]	0.26 [0.02]	0.22 [0.02]	0.31 [0.02]	0.29 [0.02]	0.28 [0.02]	0.28 [0.03]	0.29 [0.02]
Top 10 antigens	***	2.42 [0.1]	2.24 [0.1]	1.84 [0.1]	1.89 [0.09]	2.16 [0.12]	1.75 [0.1]	2.3 [0.09]	2.33 [0.11]	2.24 [0.13]	2.23 [0.16]	2.42 [0.1]
All antigens	**	0.57 [0.05]	0.66 [0.04]	0.41 [0.05]	0.46 [0.05]	0.6 [0.06]	0.47 [0.05]	0.72 [0.05]	0.61 [0.06]	0.58 [0.07]	0.66 [0.08]	0.64 [0.05]
M. tuberculosis												
Breadth score	**	0.24 [0.02]	0.24 [0.02]	0.17 [0.02]	0.18 [0.02]	0.2 [0.02]	0.15 [0.02]	0.23 [0.02]	0.2 [0.02]	0.23 [0.02]	0.23 [0.03]	0.21 [0.02]
Top 10 antigens	***	1.73 [0.1]	1.53 [0.08]	1.18 [0.08]	1.27 [0.08]	1.34 [0.08]	1.12 [0.08]	1.45 [0.07]	1.41 [0.08]	1.53 [0.1]	1.53 [0.11]	1.45 [0.09]
All antigens	**	0.56 [0.05]	0.57 [0.04]	0.35 [0.05]	0.41 [0.04]	0.41 [0.04]	0.33 [0.05]	0.52 [0.04]	0.46 [0.05]	0.52 [0.05]	0.58 [0.07]	0.47 [0.05]

***Effect of cohort via 1-way ANOVA, adj P < 0.001.

**Effect of cohort via 1-way ANOVA, adj P < 0.01.

*Effect of cohort via 1-way ANOVA, adj P < 0.05.

in Figure 2A, and IgA and IgG breadth scores for each primary pathogen within each cohort are shown in Figures 2B, C. There was an overall effect of cohort on breadth scores for ETEC, EPEC, EAEC, Shigella, S. enterica Typhi, S. aureus, S. pneumoniae, M. tuberculosis, P. falciparum, O. volvulus, and measles virus, similar to the observations with IgA and IgG levels, whereby some populations differentially recognized pathogens for IgA or IgG. LMICs had similar antibody breadth scores to HICs, with the exception of at least 5% higher breadth of *Shigella* IgA and IgG ($P < 10^{-4}$ and $P < 10^{-132}$, respectively) and *S. pneumoniae* IgG ($P < 10^{-10}$) and over 5% lower *S. aureus* IgA $(P < 10^{-10})$. IgA recognition of pathogen proteins on the array was widely distributed, with Shigella and S. pneumoniae each having the highest median breadth scores at approximately 25% of selected proteins recognized (breadth score ≈ 0.25); maximal IgA recognition was for *S. aureus* at approximately 70% (breadth score ≈ 0.7 , Figure 2A). IgG recognition was also high for *Shigella* (25%), S. aureus (39%) and S. pneumoniae (20%). Importantly, there was a larger selection of proteins for primary pathogens $(n \approx 80)$ than for secondary pathogens (n=10-15), and possibly greater enrichment for immunodominant proteins in the latter

(**Figures 2B, C**). IgA breadth scores were >0 in most samples for all primary pathogens, whereas IgG recognition was near zero in most samples for ETEC, EAEC, *S. enterica* Typhi, and *M. tuberculosis*.

The isotype specificity in human milk likely reflects the route and timing of exposure and invasiveness of bacteria. Specific IgA antibodies and IgA plasma cells in milk and colostrum occur after oral immunization or exposure (47). Such IgA responses are quite dynamic, reflecting the recent exposures in the GI tract (48). However, invasive and systemic infections may efficiently induce IgG responses, which may explain some of the differences in IgA and IgG profiles, although the systemic antibody compartment may also contribute to dimeric IgA profiles in human milk (49). Alternatively, natural, polyreactive IgA and IgM antibodies similar to those that have been described in human milk to self-antigens could explain, to some extent, the broad reactivity of IgA to bacterial pathogens across the cohorts, although they were not reactive to viral proteins (50). The purpose of such natural antibodies in milk is unclear, although they could possibly aid in developing a robust IgA response to non-invasive commensals (51).



Complex Immunospecificity Patterns Among Cohorts

As described above, significant between-cohort differences in both mean normalized intensity scores and breadth scores were identified by ANOVA for IgA responses to all primary and some secondary study pathogens (**Table 1**, **Figure 1A**, **Figure 2B**, **Table S1A**), and for most pathogen-specific IgG responses (**Table 2**, **Figures 1B** and **2C**, **Table S1B**). However, few patterns emerged from the mean normalized intensity scores except for IgA against EPEC proteins: those from some of the LMIC cohorts tended to be higher than those from Europe and Washington state, U.S.; and European and U.S. cohorts showed a slight tendency for higher IgA levels and breadth against *S. aureus* and *S. pneumoniae*. However, IgG profiles showed stark contrasts, with the most elevated antibody levels in the LMIC cohorts (**Figures 1B** and **2C**), most notably to *Shigella* proteins. The IgG trends agreed with population disease rates, such as shigellosis, which has low incidence in the U.S. and Europe (2013 U.S.: 4.82 cases per 100,000; 2014 Spain: 0.5 cases per 100,000; 2014 Sweden: 3.4 cases per 100,000) (52, 53). Whereas regional variation in IgA levels was evident, the pattern of responses at the continent level for pathogens such as EPEC and *Shigella* showed only slight differences. For primary pathogens, mean normalized intensity scores for milk samples collected in Kenya tended to be the lowest, whereas those in Peru were often the highest.

Principal component analysis (PCA) was conducted to evaluate whether complex relationships among antigen specificities within pathogen differed across the 11 cohorts. When reducing dimensionality of the data by PCA, antibody profiles clustered by geographic regions (**Figure 3**). Overall, antibody specificity patterns for Sweden, Spain and U.S.-Washington were most similar to each other, with U.S.-California, which specifically recruited mothers who identified as Hispanic, in the same hierarchical clustering branch, but most TABLE 2 | Immunoglobulin G (IgG) breadth score and mean [SEM] reactivities to the 10 most-reactive antigens, and mean reactivities to all antigens for each of the primary pathogens included on the protein array in milk produced by women living in rural Ethiopia (ETR), urban Ethiopia (ETU), rural The Gambia (GBR), urban The Gambia (GBU), Ghana (GN), Kenya (KE), Peru (PE), Spain (SP), Sweden (SW), US-California (USC), and US-Washington (USW).

Pathogen	Sig.	ETR	ETU	GBR	GBU	GN	KE	PE	SP	SW	USC	USW
ETEC												
Breadth score	**	0.01 [0]	0.02 [0]	0.03 [0]	0.03 [0]	0.03 [0]	0.03 [0.01]	0.03 [0]	0 [0]	0.01 [0]	0.01 [0]	0.01 [0]
Top 10	**	0.41 [0.03]	0.68 [0.04]	0.72 [0.05]	0.71 [0.04]	0.79 [0.04]	0.75 [0.04]	0.81 [0.04]	0.23 [0.01]	0.25 [0.02]	0.24 [0.02]	0.23 [0.02]
antigens												
All antigens	**	0.05 [0.01]	0.12 [0.01]	0.13 [0.01]	0.14 [0.01]	0.14 [0.01]	0.15 [0.02]	0.18 [0.01]	0.06 [0.01]	0.07 [0.01]	0.07 [0.02]	0.06 [0.01]
EPEC			. ,		. ,	. ,				. ,		
Breadth score	**	0.05 [0.01]	0.08 [0.01]	0.07 [0.01]	0.08 [0.01]	0.10 [0.01]	0.1 [0.01]	0.13 [0]	0.04 [0.01]	0.05 [0.01]	0.07 [0.01]	0.05 [0.01]
Top 10	**	0.98 [0.08]	1.53 [0.13]	1.26 [0.09]	1.4 [0.1]	1.67 [0.12]	1.69 [0.12]	2.37 [0.12]	0.81 [0.07]	0.90 [0.09]	1.34 [0.17]	0.96 [0.11]
antigens				[]	[]			[]				
All antigens	**	0.08.10.021	0 19 [0 02]	0 15 [0 02]	0 18 [0 02]	0 2 [0 02]	0 2 [0 02]	0.34 [0.02]	0 11 [0 01]	0 12 [0 02]	0 18 [0 04]	0 15 [0 02]
FAFC		0.00 [0.02]	0.10 [0.02]	0.10 [0.02]	0.10 [0.02]	0.2 [0.02]	0.2 [0.02]	0.01[0.02]	0.11 [0.01]	0.12 [0.02]	0.10 [0.0 1]	0.10 [0.02]
Broadth soora	**	0.01.[0]	0.01.[0]	0.01.[0]	0.01.[0]	0.01.[0]	0.02.[0]	0.03.[0]	0 [0]	0 [0]	0.01.[0]	0 [0]
Top 10	**						0.02 [0]					
		0.25 [0.02]	0.33 [0.02]	0.32 [0.02]	0.33 [0.02]	0.39 [0.02]	0.41 [0.03]	0.56 [0.04]	0.25 [0.02]	0.19 [0.02]	0.30 [0.05]	0.17 [0.01]
antigens	**	0.00 [0.04]	0.00 (0.01)	0.05 (0.04)	0.00 [0.04]	0.05 (0.04)	0.00 (0.04)	0.11 [0.01]	0.07 [0.04]	0.07 (0.04)	0.00 [0.00]	0.00 [0.04]
All antigens		0.03 [0.01]	0.06 [0.01]	0.05 [0.01]	0.06 [0.01]	0.05 [0.01]	0.06 [0.01]	0.11 [0.01]	0.07 [0.01]	0.07 [0.01]	0.08 [0.02]	0.06 [0.01]
Shigella												
Breadth score	**	0.21 [0.01]	0.26 [0.01]	0.27 [0.01]	0.26 [0.01]	0.27 [0.01]	0.25 [0.01]	0.3 [0.01]	0.01 [0]	0 [0]	0.03 [0.01]	0.01 [0.01]
Top 10	**	3.24 [0.21]	4.17 [0.2]	4.16 [0.16]	4.11 [0.2]	4.51 [0.17]	4.24 [0.23]	4.73 [0.13]	0.16 [0.06]	-0.02	0.53 [0.15]	0.18 [0.12]
antigens										[0.01]		
All antigens	**	0.64 [0.05]	0.95 [0.05]	0.95 [0.05]	0.95 [0.06]	1.04 [0.05]	0.98 [0.07]	1.16 [0.04]	0.02 [0.02]	0 [0.01]	0.08 [0.03]	0.04 [0.03]
S. enterica												
Typhi												
Breadth score	**	0.01 [0]	0.01 [0]	0.01 [0]	0.01 [0]	0.02 [0]	0.02 [0]	0.01 [0]	0 [0]	0 [0]	0 [0]	0 [0]
Top 10	**	0.18 [0.02]	0.31 [0.02]	0.41 [0.04]	0.40 [0.04]	0.48 [0.04]	0.38 [0.04]	0.42 [0.03]	0.16 [0.01]	0.15 [0.02]	0.19 [0.04]	0.13 [0.01]
antigens												
All antigens	**	-0.05 [0.01]	0.01 [0.01]	0.02 [0.01]	0.03 [0.01]	0.04 [0.01]	0.03 [0.01]	0.05 [0.01]	-0.03	-0.03	-0.02	-0.03
Ū									[0.01]	[0.01]	[0.02]	[0.01]
S. aureus											. ,	
Breadth score	**	0.34 [0.02]	0.32 [0.02]	0.43 [0.02]	0.42 [0.02]	0.42 [0.01]	0.44 [0.02]	0.38 [0.02]	0.38 [0.02]	0.42 [0.02]	0.32 [0.04]	0.37 [0.02]
Top 10	**	3 16 [0 13]	2 80 [0 11]	3 58 [0 11]	3 42 [0 12]	3 53 [0 12]	3 55 [0 14]	3 00 [0 11]	2 75 [0 11]	2 83 [0 13]	2 45 [0 2]	2 72 [0 12]
antigens		0110 [0110]	2100 [0111]	0100 [0111]	0112 [0112]	0100 [0112]	0100 [0111]	0100 [0111]	2110 [0111]	2.00 [01.0]	2110 [012]	2.1.2 [01.2]
All antigens	**	1 00 [0 05]	0.89 [0.05]	1 30 [0 06]	1 27 [0 07]	1 25 [0 05]	1 29 [0 07]	1 09 [0 05]	1 06 [0 05]	1 14 [0 07]	0.90 [0.1]	1 03 [0 06]
c		1.00 [0.00]	0.00 [0.00]	1.00 [0.00]	1.27 [0.07]	1.20 [0.00]	1.20 [0.07]	1.00 [0.00]	1.00 [0.00]	1.14 [0.07]	0.00 [0.1]	1.00 [0.00]
o. proumonico												
Proodth oppro	**	0.01 [0.01]	0.02 [0.04]	0.00 [0.01]	0.00 [0.01]	0 10 0 011	0.02 [0.01]	0.04 [0.01]	0.16 [0.01]	0 16 [0 01]	0 17 [0 00]	0 14 [0 01]
Ten 10	**	0.21 [0.01]	0.23 [0.01]	0.22 [0.01]	0.20 [0.01]	0.18 [0.01]	0.23 [0.01]	0.24 [0.01]	1.00 [0.01]	0.16[0.01]	1.00 [0.10]	0.14 [0.01]
TOP TO		2.35 [0.11]	2.38 [0.07]	2.59 [0.15]	2.36 [0.13]	2.17 [0.11]	2.60 [0.11]	2.35 [0.09]	1.99 [0.09]	1.94 [0.12]	1.96 [0.16]	1.61 [0.1]
antigens	stude	0.55 (0.0.4)	0.04.70.001	0.00 /0.051	0.57 (0.0.4)	0.50 (0.00)	0.00 10.01	0.05 (0.00)	0.40.70.001	0.10.10.0.1	0.50 (0.00)	0.45 (0.00)
All antigens	~~	0.55 [0.04]	0.61 [0.02]	0.63 [0.05]	0.57 [0.04]	0.50 [0.03]	0.66 [0.04]	0.65 [0.03]	0.48 [0.02]	0.48 [0.04]	0.50 [0.06]	0.45 [0.03]
М.												
tuberculosis												
Breadth score	*	0 [0]	0 [0]	0.01 [0]	0.01 [0]	0.01 [0]	0.02 [0.01]	0.01 [0]	0.01 [0]	0.01 [0]	0.01 [0]	0.01 [0]
Top 10	**	0.26 [0.02]	0.28 [0.02]	0.38 [0.03]	0.38 [0.03]	0.42 [0.03]	0.43 [0.04]	0.37 [0.03]	0.32 [0.02]	0.36 [0.04]	0.35 [0.04]	0.34 [0.03]
antigens												
All antigens	**	0.05 [0.01]	0.08 [0.01]	0.11 [0.01]	0.13 [0.02]	0.13 [0.02]	0.13 [0.02]	0.13 [0.01]	0.12 [0.01]	0.14 [0.01]	0.1 [0.02]	0.13 [0.01]

**Effect of cohort via 1-way ANOVA, adj P < 0.001.

*Effect of cohort via 1-way ANOVA, adj P < 0.05.

distant. Patterns for the LMIC cohorts also tended to cluster, although they were split into two separate clusters for IgA responses (**Figure 3A**). The complete set of PCA mean value ANOVA results and PCA loadings are available in the **Supplemental Information (Tables S2A, B and S3A, B**). At the pathogen-specific antibody level, there were multiple circumstances where mean values for the LMIC cohorts were categorically different from those of the HIC cohorts; these included, in general, EAEC, EPEC, ETEC, and *Shigella* (**Figures S3A-D**). Notable exceptions included mean values for PC2 and PC1 for complex EAEC- and EPEC-associated antigens, respectively, in rural Ethiopia. Values for rural Ethiopia samples appeared to be different (at least for 2 of the components) from all other cohorts for *M. tuberculosis*, suggesting that complex antigen response by IgA in this cohort was relatively unique. For *S. pneumoniae* and measles, values for Peru tended to be like those for the LMIC cohorts, and for *S. aureus* clustered similarly for Ethiopian populations. The Spain, Sweden, and U.S. cohorts clustered separately from the LMIC cohorts for IgG responses (**Figure 3B**), and clustering of pathogen-specific antigens for IgG followed a similar trend for most pathogens (**Figure S4**). Clustering the data on mean normalized signals, rather than mean PC values, showed similar trends (**Figure S5**).



FIGURE 3 | Population clustering by principle component analysis. The heat maps display the mean of each principle component (rows) for each study population (columns). For example, the mean of the first principle component (PC1) for all volunteers in Peru (PE) is summarized in a single value on the heat map. PCA was performed on (A) immunoglobulin A (IgA) responses and (B) immunoglobulin G (IgG) responses for all *in vitro* transcription and translation (IVTT) proteins represented on the multipathogen protein microarray (purified protein PCA results are shown in the **Supplemental Information**). Only the first 10 PCs are shown, capturing approximately 14% and 25% of the variation in the IgA and IgG data, respectively (a heat map of all PCs are shown in **Supplemental Information**). Populations and PCs were ordered by hierarchical clustering. The color keys show the scale of gray/yellow lower PC values to red higher PC values. Row labels include percent variation captured by each PC in brackets and P-values from ANOVA of the PC means among study populations. Abbreviations: ETR, rural Ethiopia; ETU, urban Ethiopia; GBR, rural The Gambia; GBU, urban The Gambia; GN, Ghana; KE, Kenya; PE, Peru; SP, Spain; SW, Sweden; USC, U.S.-California; USW, U.S.-Washington; PC#, principal component.

Characterization of IgA and IgG Responses to Individual Antigens

Beyond population-level trends in antibody responses to pathogen antigens as a whole, identifying the individual antigens that are recognized by IgA and IgG in human milk may provide an understanding of the immune factors that benefit infants and may protect from disease. **Tables S4A**, **B** show the reactivity levels to all antigens on the array (ranked by highest reactivity), both globally and specific to each cohort. The highest levels of IgA and IgG antibody binding were observed for specific antigens in each of the six prioritized pathogens associated with diarrheal disease, sepsis, and respiratory illnesses, as follows.

S. aureus

The strongest IgA response in human milk from all populations was against one of the S. aureus exotoxins, also known as superantigen-like protein 7, which is from a family of proteins able to stimulate immune responses regardless of antigen specificity (54). The most reactive IgG response was against the S. aureus exotoxin. Additionally, there were strong IgG responses to the components of S. aureus leukotoxins gamma-hemolysin, Panton-Valentine leukocidin (PVL), and leukocidin ED (LukED). These are multifunctional, bicomponent leukotoxins that lyse host polymorphonuclear cells such as neutrophils and macrophages (55). IgG was highly reactive to gamma hemolysin components C (hlgC) and B (hlgB), components of PVL LukF-PV and LukS-PV, and the components of LukED, LukE, and LukD; whereas IgA recognition of staphylococcal toxins was primarily to the superantigen exotoxin proteins. This suggests that IgG specificity to staphylococcal proteins is more broadly distributed than IgA responses.

EPEC, ETEC, and EAEC

IgA reactivity to EPEC proteins included intimin and the intimin receptor Tir, outer membrane proteins that associate for adherence to epithelial cells, as well as secretory system protein SseC and the secreted protein EspA, which is essential for formation of attaching and effacing lesions during EPEC pathogenesis (56, 57). A membrane protein and a flagellin subunit protein (FliC) were the most IgA reactive proteins of ETEC. For EAEC, an outer membrane autotransporter and conjugal transfer pilus assembly protein (TraB) were most IgA reactive. IgG reactivity was observed against the EPEC proteins Tir, SseC, EspA, and intimin and ETEC putative membrane proteins. EAEC had very low IgG responses.

Shigella spp

The most IgA reactive for *Shigella* spp. were a *Shigella* hemagglutinin family protein and the invasion plasmid antigen B (IpaB) for *S. flexneri* and *S. sonnei*. The most reactive IgG responses in human milk were also IpaB and other invasion plasmid antigens that overlapped with IgA reactivity.

Salmonella

The third highest IgA response among all antigens on the array was a *Salmonella* autotransporter protein, an outer membranebound translocator protein typically associated with virulence (58). It was also the most IgG-reactive protein for *Salmonella* and showed concordance with IgA reactivity.

S. pneumoniae

Numerous pneumococcal proteins previously characterized as antibody binding targets ranked among the top reactive for IgA in human milk, including the beta-galactosidase (BgaA), the phage amidase, histidine triad protein E (PhtE), pneumococcal surface protein A (PspA), and the zinc metalloproteases A and B (ZmpA and ZmpB), the latter three being diverse proteins in the pneumococcal population (59). IgG responses to *S. pneumoniae* overlapped with IgA responses, with the addition of the choline binding protein A (PcpA), which was the most reactive pneumococcal protein, is involved in adherence to nasal and lung epithelia, and is a current candidate for subunit vaccines (60). Other *S. pneumoniae* proteins such as LysM and pneumolysin were also among the most reactive antigens (59).

M. tuberculosis

The most IgA-reactive protein for *M. tuberculosis* was an uncharacterized conserved lipoprotein (LpqN) of unknown function but predicted to be associated with the cell wall and cell processes (61). *M. tuberculosis* had very low IgG responses against all of their proteins

IgA responses to secondary pathogens were heterogeneous, with minimal responses to all the arboviruses, and IgG responses to most secondary pathogen proteins was low. Collectively, the proteins most recognized by IgA in human milk represent diverse functional categories, including toxins and lytic proteins, adhesins, secreted and secretory systems, immune evasion, and antigenic diversity.

Our *a priori* hypotheses were that immunoglobulin immune specificity would vary by pathogen and cohort and be generally higher in LMIC than HIC regions of the world. **Tables S5A, B** show the reactivity levels to all antigens on the array (ranked by ANOVA P-values), both globally and specific to each cohort. **Tables S6A, B** enumerates relative IgA and IgG reactivity to all IVTT antigens on the protein array (as ranked by ANOVA P- value) by cohort for each pathogen. These data, supporting our hypothesis, indicate differences across both pathogens and cohorts in this regard. In total, the ANOVA indicated that at least one of the 11 study cohorts was differentially reactive after adjustment for multiple testing in 357 and 588 of 742 IVTT proteins for IgA and IgG, respectively. A total of 220 and 224 IVTT proteins were identified for IgA and IgG, respectively after filtering for proteins with a positive mean reactivity in at least one cohort (**Table 3**)—positive mean reactivity was defined using mixture models, a method used to empirically define cutoffs for the distribution of positive and negative signals by determining the junction between two Gaussian signal distributions for each protein which has been used for establishing cutoffs for protein microarray summary statistics (**Supplementary Methods, Figures S6A, B**) (62).

Figure 4 depicts averaged normalized signal intensities of relative mean IgA reactivity (Figure 4A) and IgG reactivity (Figure 4B) to the single most differentially reactive antigen identified for each pathogen. Several patterns emerge from these heatmaps; for instance, reactivity to the top antigen in each of the three E. coli strains was generally lower for HICs compared to LMICs. Interestingly, IgA responses to the top antigens of S. aureus and S. pneumoniae were higher in HICs than in LMICs for IgA, but IgG responses to those were reversed. These patterns held true for many other antigens. In a comparison of LMICs and HICs, 116 and 160 proteins were differentially reactive for IgA (Figure 4C) and IgG (Figure 4D), respectively (Table 3). Among these, IgA against Shigella and EPEC proteins were primarily higher in LMICs than HICs, while lower against S. aureus and S. pneumoniae proteins. Differential reactivity for ETEC and Salmonella proteins was heterogeneous-IgA to some

TABLE 3 Number (*n*) of *in vitro* transcription and translation (IVTT) proteins on each array for each pathogen; number (*n*) of differentially active proteins across cohorts (P < 0.05 via 1-way ANOVA) for immunoglobulin A (IgA) and immunoglobulin G (IgG) by pathogen; and number (*n*) of differentially active proteins between lower-to-middle-income countries (LMIC) and high-income countries (HIC) (P < 0.05 via t-test) for IgA and IgG by pathogen.

Pathogen	IVTT proteins	Ig	Α	IgG			
	on array	Proteins with differential activities across cohorts	Proteins with different activities in LMIC vs. HIC	Proteins with differential activities across cohorts	Proteins with different activities in LMIC vs. HIC		
EAEC	80	10	2	5	3		
EPEC	80	21	14	15	13		
ETEC	84	29	13	22	15		
Shigella spp.	80	39	25	42	36		
S. enterica	79	26	14	10	7		
Typhi							
S. aureus	80	32	23	61	36		
S. pneumoniae	80	32	17	37	35		
M. tuberculosis	80	21	7	16	5		
P. falciparum	15	6	0	13	9		
O. volvulus	15	2	1	0	0		
Measles	12	2	0	2	1		
Rubella	10	0	0	1	0		
Dengue Virus	12	0	0	0	0		
Zika Virus	14	0	0	0	0		
Yellow Fever Virus	12	0	0	0	0		
Chikungunya Virus	9	0	0	0	0		
TOTAL	742	220	116	224	160		



Supplemental Information. Rows represent per-pathogen proteins with the lowest P-values, and columns represent the mean normalized signals for each study population. All antigens had ANOVA adjusted P-values < 0.05, with the exception of the DENV envelope protein for IgA (P=0.06). (**C**, **D**) The volcano plots show the log-fold increase in IgA and IgG levels, respectively, between LMIC and HIC cohorts on the x-axis by the inverse log₁₀ unadjusted P-value on the y-axis. Each point represents a protein on the multipathogen array that has been colored by pathogen. Filled triangles represent proteins that remain significantly differentially reactive after adjustment, defined as an adjusted P-value < 0.05 and mean normalized signal above the mixed model cutoffs (**Figure S6**) in at least one of the comparator groups. Points to the right of zero indicate higher antibody levels in LMICs, whereas points left of zero indicate higher levels in HICs. Abbreviations: ETEC, enteropathogenic *E. coli*; EAEC, enteropagregative *E. coli*; LMIC, lower- and middle-income country; ETR, rural Ethiopia; ETU, urban Ethiopia; GBR, rural The Gambia; GBU, urban The Gambia; GN, Ghana; KE, Kenya; PE, Peru; SP, Spain; SW, Sweden; USC, U.S.-California; USW, U.S.-Washington.

proteins were higher in LMICs, while others were higher in HICs. IgG responses were predominantly higher in LMICs, especially for *Shigella* proteins, except for *S. aureus* which had heterogeneous differential reactivity. The list of all antigens in the comparison of IgA and IgG in LMICs and HICs is shown in **Tables S7A, B**, and the top single differentially reactive antigens and clinical relevance are shown in **Table S8**.

The most differentially reactive proteins represented diverse functional categories and had substantial overlap with the most broadly reactive proteins. For example, the most significant *Shigella* IgA and IgG responses were to IpaB and other invasion plasmid antigens, which are multifunctional proteins that are part of the virulence associated genes in the virulence plasmid, involved in the type III secretion system, adhesion, and immune evasion through destruction of phagosomes (63). The *S. flexneri* serine protease A (SepA) is a major extracellular protein involved in disruption of the epithelial barrier during infection and one of the top differentially reactive *Shigella* proteins for both IgA and IgG (64). Likewise, the top ETEC protein (serine protease EatA, a member of an autotransporter family of virulence factors) shares 80% sequence homology with S. flexneri SepA and is currently the subject of subunit vaccine development (65). Among other diarrheal pathogen adhesins, IgA against EPEC major structural subunit of bundle-forming pilus BfpA, which is involved in attachment to epithelial cells, and a type II/IV secretion system family protein were highest in LMICs (66). The Peruvian cohort had the highest IgA response to ETEC two-partner secreted adhesin EtpA and EPEC intimin, both involved in epithelial cell adherence (58, 67). ETEC-specific proteins such as EatA and EtpA were positive for IgG in LMICs, but at low normalized intensity. Conversely, ETEC FliC - a major subunit flagellar protein and target for vaccine development - was highest in HICs for IgA and in both HICs and the Peruvian cohort for IgG (68). IgG levels to the EPEC EspB family protein were highest in LMICs. EspB, like Shigella Ipa proteins, is a type III secretion system protein and key virulence factor required for attaching and effacing (69). The pneumococcal adhesin PclA, which is a conserved protein found

within the *S. pneumoniae* variome had higher IgA reactivity in HICs, but heterogeneous IgG reactivity among the cohorts (70, 71).

Toxins and lytic proteins were another strongly represented class of reactive proteins. Salmonella hemolysin E, a pore forming toxin with potential therapeutic antibody application, was reactive in LMICs and mostly nonreactive in HICs; but overall levels were low (Figure 4A) (72). ETEC accessory colonization factor YghJ, which has mucinolytic activity and used for intestinal colonization, was particularly high in the Peruvian and U.S.-California cohorts (69). The contrast between IgA and IgG responses to S. aureus toxins was observed in multiple exotoxins, as well as the CHAP domain family, which is associated with phage lytic proteins in both bacterial and staphylococcal phage genomes, where IgA reactivity was higher in HICs, while IgG reactivity was higher in LMICs (73). This pattern did not apply to the leukotoxins PVL and LukED. Both IgA and IgG responses to the components of PVL and LukED were higher in LMICs than in HICs. The collinearity of components is expected, since the pore-forming bicomponent leukotoxins must be together to have toxin activity (74). Interestingly, IgA targeting the M. tuberculosis ESX-1 secretion-associated protein EspK, a multifunctional protein involved in permeabilization of macrophage phagosomal membranes, was particularly high in rural Ethiopia, but also reactive in all cohorts (75).

Several proteins involved in immune evasion were also differentially reactive. The S. aureus sdrE protein is a human factor H-binding protein used for immune evasion of complement, similar to the fHbp protein in N. meningitidis, which is a component of a multivalent subunit vaccine (76). Chemotaxis-inhibiting protein CHIPS also evades complement by binding and blocking C5a receptor in neutrophils and monocytes (77). Both had higher IgA reactivity in HICs, although IgG responses were similar between cohorts with the exception of lower IgG reactivity in the Ethiopian cohorts. An EAEC serine protease autotransporter (Pic) is also involved in complement evasion, as well as mucinolytic activity and colonization, and is a protein family secreted by both EAEC and S. flexneri (77-79). IgG responses to the highly diverse pneumococcal degradative enzyme immunoglobulin A1 protease, or zinc metalloprotease ZmpA, was lower in HICs (59).

Purified recombinant proteins were printed onto the array for a measure of agreement between two systems of protein expression. The distribution of purified protein signals by population agreed with the trends observed with IVTT proteins (**Figure S7**), except for higher *S. pneumoniae* and *S. aureus* specific IgA levels in LMICs. This deviation may be due to the limited selection of recombinant purified proteins available for printing on the array. Indeed, the individual pneumococcal and staphylococcal purified proteins showing differential reactivity by ANOVA (**Tables S9A, B**) and t-test (**Tables S10A, B**) highlight staphylococcal leukotoxin proteins that were in concordance with higher LMIC IgA against IVTT leukocidins and hemolysins, and the most differentially reactive pneumococcal purified proteins were multiple variants of pneumococcal surface protein A, which had nonsignificant differential reactivity for the IVTT protein and may be influenced by strain specificity (**Table S7A**).

Biological and Environmental Predictors of Immune Specificity

Linear regression models were used to examine the possibility that various biological and environmental factors were related to variation in immune specificity to the antigens for each pathogen (Tables S11A, B). These variables included maternal age, infant sex, time postpartum, parity, delivery mode, maternal BMI, maternal height, presence of companion animals in the home, presence of agricultural animals in the home, and household density. The trends for each factor are shown in volcano plots of the regression coefficients in Figures S8 and S9. The most notable associations were with the underweight BMI code; underweight women (BMI < 18.5 kg/m^2) tended to have higher IgA responses, although none remained significant after adjusting for the false discovery rate. Other factors, notably mother's age and household density with positive trends and cesarean delivery with a negative trend, showed association with numerous antibodies, but also did not remain significant after adjusting for the false discovery rate.

CONCLUSIONS

Results from this study provide evidence that high-throughput protein array technology can be used to investigate IgA and IgG specificity to a variety of pathogens in human milk underlying substantial infant morbidity and mortality around the world. In addition, our findings support our overarching hypothesis that IgA and IgG specificity varies by pathogen, cohort, and socioeconomic level. Although immune reactivity was generally higher in LMICs than HICs, this was not always true – for instance as it related to IgG reactivity to some antigens associated with *S. aureus*, *S. pneumoniae*, and *M. tuberculosis*. These findings form the basis for additional studies that are needed to determine if variation in milk-borne immunoglobulin reactivity to specific pathogens and/or their antigens is related to variation in infant disease risk and/or severity.

DATA AVAILABILITY STATEMENT

The original contributions presented in the study are publicly available. This data can be found here: https://www.ncbi.nlm.nih. gov/geo/query/acc.cgi?acc=GSE163903.

ETHICS STATEMENT

The studies involving human participants were reviewed and approved by the Washington State University Institutional Review Board (#13264). The patients/participants provided their written informed consent to participate in this study.

AUTHOR CONTRIBUTIONS

MKM, CM, JW, DS, EK-M, EK, SM, SEM, AP, JF, GO, JR, RP, LB, and MAM designed parent study (the INSPIRE study) and/ or oversaw collection of milk samples. MKM, JW, KJ, and AS developed methods for preparation of milk samples for protein array analysis. AR and JC oversaw down-selection of antigens for protein array analysis. KJ and AS provided expertise regarding the immunology of human milk. JC and AR designed and supervised the protein array experiments. AR conducted bioinformatics and statistical analyses. MKM and JC were primary authors for manuscript. All authors contributed to the article and approved the submitted version.

FUNDING

Sample collection was funded by the National Science Foundation (award #1344288). Sterile, single-use milk collection kits were kindly provided by Medela, Inc. (McHenry, IL). The Bill and Melinda Gates Foundation (OPP1174492) funded the immunospecificity work which makes up the majority of this report.

ACKNOWLEDGMENTS

In addition to all of the women and infants who participated in this study, we would sincerely like to thank Linda Kvist (Lund University) and her team for overseeing milk and data collection for the Swedish cohort; Andrew Doel (MRC Unit, The Gambia) for field supervision and logistics planning, and Alansan Sey for questionnaire administration, and taking anthropometric measurements in The Gambia; Jane Odei (University of Ghana) for supervising field data collection in Ghana; Katherine Flores (Washington State University), Dubale Gebeyehu (Hawassa University), Haile Belachew (Hawassa University), and Birhanu Sintayehu for planning, logistics, recruiting, and data collection and administration and staff at

REFERENCES

- American Academy of Pediatrics Section on Breastfeeding. Breastfeeding and the use of human milk. *Pediatrics* (2012) 129:e827–41. doi: 10.1542/ peds.2011-3552
- World Health Organization. Exclusive breastfeeding for six months best for babies everywhere. Statement. WHO (2011) Available at: http://www. who.int/mediacentre/news/statements/2011/breastfeeding_20110115/en/, January 15, 2011.
- Wold AE, Adlerberth I. Breast feeding and the intestinal microflora of the infant - implications for protection against infectious diseases. *Adv Exp Med Biol* (2000) 478:77–93. doi: 10.1007/0-306-46830-1_7
- Verduci E, Martelli A, Miniello VL, Landi M, Mariani B, Brambilla M, et al. Nutrition in the first 1000 days and respiratory health: A descriptive review of the last five years' literature. *Allergol Immunopathol (Madr)* (2017) 45(4):405–13. doi: 10.1016/j.aller.2017.01.003

Adare Hospital in Hawassa for assistance with logistics in Ethiopia; Catherine O. Sarange (Egerton University) for field supervision and logistics planning, and Milka W. Churuge and Minne M. Gachau for recruiting, questionnaire administration, and taking anthropometric measurements in Kenya; Gisella Barbagelatta (Instituto de Investigación Nutricional) for field supervision and logistics planning, and Patricia Calderon (Instituto de Investigación Nutricional) for recruiting, questionnaire administration, and taking anthropometric measurements, and Roxana Barrutia (Instituto de Investigación Nutricional) for the management and shipping of samples in Peru; Lorena Ruíz (Complutense University of Madrid) for technical assistance and expertise, and M. Ángeles Checa (Zaragoza, Spain), Katalina Legarra (Guernica, Spain), and Julia Minguez (Huesca, Spain) for participation in the collection of samples in Spain; Kirsti Kaski and Maije Sjöstrand (both Helsingborg Hospital) for participation in the collection of samples, questionnaire administration, and anthropometric measurements in Sweden; Renee Bridge and Kara Sunderland (both University of California, San Diego) and Kimberly Lackey and Janae Carrothers (University of Idaho and Washington State University) for logistics planning, recruiting, questionnaire administration, sample collection, and taking anthropometric measurements in Washington; Romana Hyde (University of Idaho) and Kimberly Lackey (University of Idaho) for technical assistance in preparing the samples for array analysis; and Glenn Miller (Washington State University) for his expertise and critical logistic help needed for shipping samples and supplies worldwide. From Antigen Discovery, Inc., we thank Andy Teng, Chris Hung, Jozelyn Pablo, Adam Shandling and Johnathon Truong for performing lab experiments; and Angela Yee and Xioawu Liang for leadership in initiation of the breast milk immunoprofiling platform.

SUPPLEMENTARY MATERIAL

The Supplementary Material for this article can be found online at: https://www.frontiersin.org/articles/10.3389/fimmu.2020.614372/full#supplementary-material

- 5. Oddy WH. Infant feeding and obesity risk in the child. *Breastfeed Rev* (2012) 20(2):7–12.
- Owen CG, Whincup PH, Cook DG. Breast-feeding and cardiovascular risk factors and outcomes in later life: evidence from epidemiological studies. *Proc Nutr Soc* (2011) 70(4):478–84. doi: 10.1017/S0029665111000590
- Fewtrell MS. Breast-feeding and later risk of CVD and obesity: evidence from randomised trials. *Proc Nutr Soc* (2011) 70(4):472–7. doi: 10.1017/ S0029665111000589
- Morozov V, Hansman G, Hanisch FG, Schroten H, Kunz C. Human milk oligosaccharides as promising antivirals. *Mol Nutr Food Res* (2018) 62(6): e1700679. doi: 10.1002/mnfr.201700679
- Ackerman DL, Craft KM, Doster RS, Weitkamp JH, Aronoff DM, Gaddy JA, et al. Antimicrobial and antibiofilm activity of human milk oligosaccharides against Streptococcus agalactiae, Staphylococcus aureus, and Acinetobacter baumannii. ACS Infect Dis (2017) 4(3):315–24. doi: 10.1021/acsinfecdis.7b00183

- Palmeira P, Carneiro-Sampaio M. Immunology of breast milk. Rev Assoc Med Bras (1992) (2016) 62(6):584–93. doi: 10.1590/1806-9282.62.06.584
- Lönnerdal B. Bioactive proteins in human milk: mechanisms of action. J Pediatr (2010) 156(2 Suppl):S26–30. doi: 10.1016/j.jpeds.2009.11.017
- Hunt KM, Foster JA, Forney LJ, Schütte UM, Beck DL, Abdo Z, et al. Characterization of the diversity and temporal stability of bacterial communities in human milk. *PloS One* (2011) 6(6):e21313. doi: 10.1371/ journal.pone.0021313
- Fernández L, Langa S, Martín V, Maldonado A, Jiménez E, Martín R, et al. The human milk microbiota: origin and potential roles in health and disease. *Pharmacol Res* (2013) 69(1):1–10. doi: 10.1016/j.phrs.2012.09.001
- Williams JE, Carrothers JM, Lackey KA, Beatty NF, York MA, Brooker SL, et al. Human milk microbial community structure is relatively stable and related to variations in macronutrient and micronutrient intakes in healthy lactating women. J Nutr (2017) 147(9):1739–48. doi: 10.3945/jn.117.248864
- 15. Williams JE, Carrothers JM, Lackey KA, Beatty NF, Brooker SL, Peterson HK, et al. Strong multivariate relationships exist among milk, oral, and fecal microbiomes in mother-infant dyads during the first six months postpartum. *J Nutr* (2019) 149(6):902–14. doi: 10.1093/jn/nxy299
- Lackey KA, Williams JE, Meehan CL, Zachek JA, Benda ED, Price WJ, et al. What's normal? Microbiomes in human milk and infant feces are related to each other but vary geographically. *Front Nutr* (2019) 6:45:45. doi: 10.3389/ fnut.2019.00045
- Hassiotou F, Hepworth AR, Metzger P, Tat Lai C, Trengove N, Hartmann PE, et al. Maternal and infant infections stimulate a rapid leukocyte response in breastmilk. *Clin Transl Immunol* (2013) 2(4):e3. doi: 10.1038/cti.2013.1
- Pedersen SH, Wilkinson AL, Andreasen A, Kinung'hi SM, Urassa M, Michael D, et al. Longitudinal analysis of mature breastmilk and serum immune composition among mixed HIV-status mothers and their infants. *Clin Nutr* (2016) 35(4):871–9. doi: 10.1016/j.clnu.2015.05.016
- Hanson LA. Breastfeeding provides passive and likely long-lasting active immunity. Ann Allergy Asthma Immunol (1998) 81(6):523–33. doi: 10.1016/ S1081-1206(10)62704-4
- Carlsson B, Hanson LA. Immunologic effects of breast-feeding on the infant. In: P Ogra, ME Lamm, W Strober, JR McGhee, J Bienestock, editors. *Handbook of Mucosal Immunology*. Cambridge, Massachusetts: Academic Press (1994). doi: 10.1016/B978-0-12-524730-6.50057-9
- 21. Carbonare SB, Silva ML, Palmeira P, Carneiro-Sampaio MM. Human colostrum IgA antibodies reacting to enteropathogenic Escherichia coli antigens and their persistence in the faeces of a breastfed infant. *J Diarrhoeal Dis Res* (1997) 15(2):53–8.
- Gomes TA, Elias WP, Scaletsky IC, Guth BE, Rodrigues JF, Piazza RM, et al. Diarrheagenic Escherichia coli. *Braz J Microbiol* (2016) 47:3–30. doi: 10.1016/ j.bjm.2016.10.015
- Walterspiel JN, Morrow AL, Guerrero ML, Ruiz-Palacios GM, Pickering LK. Secretory anti-Giardia lamblia antibodies in human milk: protective effect against diarrhea. *Pediatrics* (1994) 93(1):28–31.
- Cleary TG, West MS, Ruiz-Palacios G, Winsor DK, Calva JJ, Guerrero ML, et al. Human milk secretory immunoglobulin A to Shigella virulence plasmidcoded antigens. *J Pediatr* (1991) 118(1):34–8. doi: 10.1016/S0022-3476(05) 81840-2
- Hayani KC, Guerrero ML, Ruiz-Palacios GM, Gomez HF, Cleary TG. Evidence for long-term memory of the mucosal immune system: milk secretory immunoglobulin A against Shigella lipopolysaccharides. J Clin Microbiol (1991) 29(11):2599–603. doi: 10.1128/JCM.29.11.2599-2603.1991
- 26. Ciardelli L, Garofoli F, Avanzini MA, De Silvestri A, Gasparoni A, Sabatino G, et al. Escherichia coli specific secretory IgA and cytokines in human milk from mothers of different ethnic groups resident in northern Italy. *Int J Immunopathol Pharmacol* (2007) 20(2):335–40. doi: 10.1177/039463200702000213
- Hayani KC, Guerrero ML, Morrow AL, Gomez HF, Winsor DK, Ruiz-Palacios GM, et al. Concentration of milk secretory immunoglobulin A against Shigella virulence plasmid-associated antigens as a predictor of symptom status in Shigella-infected breast-fed infants. *J Pediatr* (1992) 121(6):852–6. doi: 10.1016/S0022-3476(05)80327-0
- Crompton PD, Kayala MA, Traore B, Kayentao K, Ongoiba A, Weiss GE, et al. A prospective analysis of the Ab response to Plasmodium falciparum before

and after a malaria season by protein microarray. *Proc Natl Acad Sci USA* (2010) 107:6958–63. doi: 10.1073/pnas.1001323107

- 29. Cruz-Fisher MI, Cheng C, Sun G, Pal S, Teng A, Molina DM, et al. Identification of immunodominant antigens by hybridization a whole Chlamydia trachomatis open reading frame proteome microarray using sera from immunized mice. *Infect Immun* (2011) 79(1):246–57. doi: 10.1128/ IAI.00626-10
- Liang L, Leng D, Burk C, Nakajima-Sasaki R, Kayala MA, Atluri VL, et al. Large scale immune profiling of infected humans and goats reveals differential recognition of Brucella melitensis antigens. *PloS Negl Trop Dis* (2010) 4:e673. doi: 10.1371/journal.pntd.0000673
- Ruiz L, Espinosa-Martos I, García-Carral C, Manzano S, McGuire MK, Meehan CL, et al. What's normal? Immune profiling of human milk from healthy women living in different geographical and socioeconomic settings. *Front Immunol* (2017) 308:696. doi: 10.3389/fimmu.2017.00696
- 32. The World Bank. World Bank country and lending groups. The World Bank Group (2020). Available at: https://datahelpdesk.worldbank.org/ knowledgebase/articles/906519-world-bank-country-and-lending-groups.
- 33. McGuire MK, Meehan CL, McGuire MA, Williams JE, Foster J, Sellen DW, et al. What's normal? Oligosaccharide concentrations and profiles in milk produced by healthy women vary geographically. *Am J Clin Nutr* (2017) 105 (5):1086–100. doi: 10.3945/ajcn.116.139980
- 34. Lackey KA, Williams JE, Price WJ, Carrothers JM, Brooker SL, Shafii B, et al. Comparison of commercially-available preservatives for maintaining the integrity of bacterial DNA in human milk. *Microbiol Methods* (2017) 141:73–81. doi: 10.1016/j.mimet.2017.08.002
- 35. Espinosa-Martos I, Montilla A, de Segura AG, Escuder D, Bustos G, Pallas C, et al. Bacteriological, biochemical, and immunological modifications in human colostrum after Holder pasteurization. J Pediatr Gastroenterol Nutr (2013) 56(5):560–8. doi: 10.1097/MPG.0b013e31828392ed
- 36. Ndungo E, Randall A, Hazen TH, Kania DA, Trappl-Kimmons K, Liang X, et al. A novel Shigella proteome microarray discriminates targets of human antibody reactivity following oral vaccination and experimental challenge. *mSphere* (2018) 3(4):e00260–18. doi: 10.1128/mSphere.00260-18
- 37. Davies DH, Liang X, Hernandez JE, Randall A, Hirst S, Mu Y, et al. Profiling the humoral immune response to infection by using proteome microarrays: high-throughput vaccine and diagnostic antigen discovery. *Proc Natl Acad Sci* USA (2005) 102(3):547–52. doi: 10.1073/pnas.0408782102
- Benjamini Y, Hochberg Y. Controlling the false discovery rate: a practical and powerful approach to multiple testing. J R Stat Soc B (1995) 57(1):289–300. doi: 10.2307/2346101
- Smith I. Mycobacterium tuberculosis pathogenesis and molecular determinants of virulence. *Clin Microbiol Rev* (2003) 16(3):463–96. doi: 10.1128/CMR.16.3.463-496.2003
- World Health Organization. Global tuberculosis report. WHO (2017). Available at: http://apps.who.int/iris/bitstream/10665/259366/1/ 9789241565516-eng.pdf?ua=1.
- Ghodbane R, Mba Medie F, Lepidi H, Nappez C, Drancourt M. Long-term survival of tuberculosis complex mycobacteria in soil. *Microbiology* (2014) WHO 160(Pt 3):496–501. doi: 10.1099/mic.0.073379-0
- Wang SL, Coonley F. Occurrence of tubercle bacilli in breast milk of tuberculous women. JAMA (1917) LXIX(7):531-2. doi: 10.1001/ jama.1917.02590340031009
- World Health Organization. Breastfeeding and maternal tuberculosis. WHO (1998). Available at: http://www.who.int/maternal_child_adolescent/ documents/pdfs/breastfeeding_and_maternal_tb.pdf?ua=1.
- Perley CC, Frahm M, Click EM, Dobos KM, Ferrari G, Stout JE, et al. The human antibody response to the surface of Mycobacterium tuberculosis. *PloS One* (2014) 9(6):e98938. doi: 10.1371/journal.pone.0098938
- 45. Lindestam Arlehamn CS, Paul S, Mele F, Huang C, Greenbaum JA, Vita R, et al. Immunological consequences of intragenus conservation of Mycobacterium tuberculosis T-cell epitopes. *Proc Natl Acad Sci USA* (2015) 112(2):E147–55. doi: 10.1073/pnas.1416537112
- 46. Scriba TJ, Carpenter C, Pro SC, Sidney J, Musvosvi M, Rozot V, et al. Differential recognition of Mycobacterium tuberculosis-specific epitopes as a function of tuberculosis disease history. *Am J Respir Crit Care Med* (2017) 196(6):772–81. doi: 10.1164/rccm.201706-1208OC

- Roux ME, McWilliams M, Phillips-Quagliata JM, Weisz-Carrington P, Lamm ME. Origin of IgA-secreting plasma cells in the mammary gland. J Exp Med (1977) 146:1311–22. doi: 10.1084/jem.146.5.1311
- Hapfelmeier S, Lawson MA, Slack E, Kirundi JK, Stoel M, Heikenwalder M, et al. Reversible microbial colonization of germ-free mice reveals the dynamics of IgA immune responses. *Sci (New York NY)* (2010) 328(5986):1705–9. doi: 10.1126/science.1188454
- Fouda GG, Eudailey J, Kunz EL, Amos JD, Liebl BE, Himes J, et al. Systemic administration of an HIV-1 broadly neutralizing dimeric IgA yields mucosal secretory IgA and virus neutralization. *Mucosal Immunol* (2017) 10(1):228– 37. doi: 10.1038/mi.2016.32
- Vassilev TL, Veleva KV. Natural polyreactive IgA and IgM autoantibodies in human colostrum. *Scand J Immunol* (1996) 44:535–9. doi: 10.1046/j.1365-3083.1996.d01-333.x
- 51. Fransen F, Zagato E, Mazzini E, Fosso B, Manzari C, El Aidy S, et al. BALB/c and C57BL/6 mice differ in polyreactive IgA abundance, which impacts the generation of antigen-specific IgA and microbiota diversity. *Immunity* (2015) 43:527–40. doi: 10.1016/j.immuni.2015.08.011
- Centers for Disease Control and Prevention. Foodborne Diseases Active Surveillance Network (FoodNet): FoodNet Surveillance Report for 2011 (Final Report). Atlanta, Georgia: U.S. Department of Health and Human Services, CDC (2012).
- European Centre for Disease Prevention and Control. Annual Epidemiological Report 2016 - Shigellosis. Stockholm: ECDC (2016). Available at: https://ecdc. europa.eu/en/publications-data/shigellosis-annual-epidemiological-report-2016-2014-data.
- Dinges MM, Orwin PM, Schlievert PM. Exotoxins of Staphylococcus aureus. Clin Microbiol Rev (2000) 13(1):16–34. doi: 10.1128/CMR.13.1.16
- Gravet A, Colin DA, Keller D, Girardot R, Monteil H, Prévost G. Characterization of a novel structural member, LukE-LukD, of the bicomponent staphylococcal leucotoxins family. *FEBS Lett* (1998) 436 (2):202-8. doi: 10.1016/S0014-5793(98)01130-2
- Hartland EL, Batchelor M, Delahay RM, Hale C, Matthews S, Dougan G, et al. Binding of intimin from enteropathogenic Escherichia coli to Tir and to host cells. *Mol Microbiol* (1999) 32(1):151–8. doi: 10.1046/j.1365-2958. 1999.01338.x
- 57. Kenny B, Lai LC, Finlay BB, Donnenberg MS. EspA, a protein secreted by enteropathogenic Escherichia coli, is required to induce signals in epithelial cells. *Mol Microbiol* (1996) 20(2):313–23. doi: 10.1111/j.1365-2958.1996.tb02619.x
- Benz I, Schmidt MA. Structures and functions of autotransporter proteins in microbial pathogens. *Int J Med Microbiol* (2011) 301(6):461–8. doi: 10.1016/ j.ijmm.2011.03.003
- Croucher NJ, Campo JJ, Le TQ, Liang X, Bentley SD, Hanage WP, et al. Diverse evolutionary patterns of pneumococcal antigens identified by pangenome-wide immunological screening. *Proc Natl Acad Sci USA* (2017) 114(3):E357–66. doi: 10.1073/pnas.1613937114
- 60. Khan MN, Sharma SK, Filkins LM, Pichichero ME. PcpA of Streptococcus pneumoniae mediates adherence to nasopharyngeal and lung epithelial cells and elicits functional antibodies in humans. *Microbes Infect* (2012) 14 (12):1102–10. doi: 10.1016/j.micinf.2012.06.007
- Kapopoulou A, Lew JM, Cole ST. The MycoBrowser portal: a comprehensive and manually annotated resource for mycobacterial genomes. *Tuberculosis* (*Edinb*) (2011) 91(1):8–13. doi: 10.1016/j.tube.2010.09.006
- 62. Stone WJR, Campo JJ, Ouédraogo AL, Meerstein-Kessel L, Morlais I, Da D, et al. Unravelling the immune signature of Plasmodium falciparum transmission-reducing immunity. Nat Commun (2018) 9(1):558. doi: 10.1038/s41467-017-02646-2.82
- 63. Yang SC, Hung CF, Aljuffali IA, Fang JY. The roles of the virulence factor IpaB in Shigella spp. in the escape from immune cells and invasion of epithelial cells. *Microbiol Res* (2015) 181:43–51. doi: 10.1016/j.micres.2015.08.006
- Patel SK, Dotson J, Allen KP, Fleckenstein JM. Identification and molecular characterization of EatA, an autotransporter protein of enterotoxigenic Escherichia coli. *Infect Immun* (2004) 72(3):1786–94. doi: 10.1128/ IAI.72.3.1786-1794.2004
- Kumar P, Luo Q, Vickers TJ, Sheikh A, Lewis WG, Fleckenstein JM. EatA, an immunogenic protective antigen of enterotoxigenic Escherichia coli, degrades intestinal mucin. *Infect Immun* (2014) 82(2):500–8. doi: 10.1128/IAI.01078-13

- Ramboarina S, Fernandes PJ, Daniell S, Islam S, Simpson P, Frankel G, et al. Structure of the bundle-forming pilus from enteropathogenic Escherichia coli. *J Biol Chem* (2005) 280(48):40252–60. doi: 10.1074/jbc.M508099200
- Fleckenstein JM, Roy K, Fischer JF, Burkitt M. Identification of a two-partner secretion locus of enterotoxigenic Escherichia coli. *Infect Immun* (2006) 74 (4):2245–58. doi: 10.1128/IAI.74.4.2245-2258.2006
- Roy K, Hamilton D, Ostmann MM, Fleckenstein JM. Vaccination with EtpA glycoprotein or flagellin protects against colonization with enterotoxigenic Escherichia coli in a murine model. *Vaccine* (2009) 27(34):4601–8. doi: 10.1016/j.vaccine.2009.05.076
- 69. Luo Q, Kumar P, Vickers TJ, Sheikh A, Lewis WG, Rasko DA, et al. Enterotoxigenic Escherichia coli secretes a highly conserved mucindegrading metalloprotease to effectively engage intestinal epithelial cells. *Infect Immun* (2014) 82(2):509–21. doi: 10.1128/IAI.01106-13
- Paterson GK, Nieminen L, Jefferies JM, Mitchell TJ. PclA, a pneumococcal collagen-like protein with selected strain distribution, contributes to adherence and invasion of host cells. *FEMS Microbiol Lett* (2008) 285 (2):170–6. doi: 10.1111/j.1574-6968.2008.01217.x
- Gámez G, Castro A, Gómez-Mejia A, Gallego M, Bedoya A, Camargo M, et al. The variome of pneumococcal virulence factors and regulators. *BMC Genomics* (2018) 19(1):10. doi: 10.1186/s12864-017-4376-0
- Chin CF, Lai JY, Choong YS, Anthony AA, Ismail A, Lim TS. Delineation of B-cell Epitopes of Salmonella enterica serovar Typhi Hemolysin E: Potential antibody therapeutic target. *Sci Rep* (2017) 7(1):2176. doi: 10.1038/s41598-017-01987-8
- Zou Y, Hou C. Systematic analysis of an amidase domain CHAP in 12 Staphylococcus aureus genomes and 44 staphylococcal phage genomes. *Comput Biol Chem* (2010) 34(4):251–7. doi: 10.1016/j.compbiolchem.2010.07.001
- Meyer F, Girardot R, Piémont Y, Prévost G, Colin DA. Analysis of the specificity of Panton-Valentine leucocidin and gamma-hemolysin F component binding. *Infect Immun* (2009) 77(1):266–73. doi: 10.1128/IAI.00402-08
- Solomonson M, Setiaputra D, Makepeace KAT, Lameignere E, Petrotchenko EV, Conrady DG, et al. Structure of EspB from the ESX-1 type VII secretion system and insights into its export mechanism. *Structure* (2015) 23(3):571–83. doi: 10.1016/j.str.2015.01.002
- Seib KL, Scarselli M, Comanducci M, Toneatto D, Masignani V. Neisseria meningitidis factor H-binding protein fHbp: a key virulence factor and vaccine antigen. *Expert Rev Vaccines* (2015) 14(6):841–59. doi: 10.1586/ 14760584.2015.1016915
- Postma B, Poppelier MJ, van Galen JC, Prossnitz ER, van Strijp JA, de Haas CJ, et al. Chemotaxis inhibitory protein of Staphylococcus aureus binds specifically to the C5a and formylated peptide receptor. *J Immunol* (2004) 172(11):6994–7001. doi: 10.4049/jimmunol.172.11.6994
- Abreu AG, Fraga TR, Granados Martínez AP, Kondo MY, Juliano MA, Juliano L, et al. The serine protease Pic From enteroaggregative Escherichia coli mediates immune evasion by the direct cleavage of complement proteins. *J Infect Dis* (2015) 212(1):106–15. doi: 10.1093/infdis/jiv013
- Harrington SM, Sheikh J, Henderson IR, Ruiz-Perez F, Cohen PS, Nataro JP. The Pic protease of enteroaggregative Escherichia coli promotes intestinal colonization and growth in the presence of mucin. *Infect Immun* (2009) 77 (6):2465–73. doi: 10.1128/IAI.01494-08

Conflict of Interest: AR and JC are employees of Antigen Discovery Incorporated, a company that carries patents related to the protein array analyses used here and the location where the arrays were conducted.

The remaining authors declare that the research was conducted in the absence of any commercial or financial relationships that could be construed as a potential conflict of interest.

Copyright © 2021 McGuire, Randall, Seppo, Järvinen, Meehan, Gindola, Williams, Sellen, Kamau-Mbuthia, Kamundia, Mbugua, Moore, Prentice, Foster, Otoo, Rodríguez, Pareja, Bode, McGuire and Campo. This is an open-access article distributed under the terms of the Creative Commons Attribution License (CC BY). The use, distribution or reproduction in other forums is permitted, provided the original author(s) and the copyright owner(s) are credited and that the original publication in this journal is cited, in accordance with accepted academic practice. No use, distribution or reproduction is permitted which does not comply with these terms.