

# The Gut Microbiota is Associated with the Small Intestinal Paracellular Permeability and the Development of the Immune System in Healthy Children During the First Two Years of Life

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## Research

**Keywords:** Zonulin, Calprotectin, Gut microbiota, Gut permeability, Newborn

**DOI:** <https://doi.org/10.21203/rs.3.rs-154335/v1>

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# Abstract

## Background

The intestinal barrier plays an important role in the defense against infections, and nutritional, endocrine, and immune functions. The gut microbiota playing important role in development of the gastrointestinal tract can impact intestinal permeability and immunity during early life, but data concerning this problem are scarce.

## Methods

We analyzed the microbiota in fecal samples (101 samples in total) collected longitudinally over 24 months from 21 newborns to investigate whether the markers of small intestinal paracellular permeability (zonulin) and immune system development (calprotectin) are linked to the gut microbiota. The results were validated using data from an independent cohort that included the calprotectin and gut microbiota in children during the first year of life.

## Results

Zonulin levels tended to increase for up to 6 months after childbirth and stabilize thereafter remaining at a high level while calprotectin concentration was high after childbirth and begun to decline from 6 months of life. The gut microbiota composition and the related metabolic potentials changed during the first two years of life and were correlated with zonulin and calprotectin levels. Fecal calprotectin correlated inversely with alpha diversity (Shannon index,  $r = -0.30$ , FDR  $P(Q) = 0.039$ ). It also correlated with seven taxa; i.a. negatively with Ruminococcaceae ( $r = -0.34$ ,  $Q = 0.046$ ), and Clostridiales ( $r = -0.34$ ,  $Q = 0.048$ ) and positively with *Staphylococcus* ( $r = 0.38$ ,  $Q = 0.023$ ) and Staphylococcaceae ( $r = 0.35$ ,  $Q = 0.04$ ), whereas zonulin correlated with 19 taxa; i.a. with Bacillales ( $r = -0.52$ ,  $Q = 0.0004$ ), Clostridiales ( $r = 0.48$ ,  $Q = 0.001$ ) and the *Ruminococcus* (*torques* group) ( $r = 0.40$ ,  $Q = 0.026$ ). When time intervals were considered only changes in abundance of the *Ruminococcus* (*torques* group) were associated with changes in calprotectin ( $\beta = 2.94$ ,  $SE = 0.8$ ,  $Q = 0.015$ ). The dynamics of stool calprotectin was negatively associated with changes in two MetaCyc pathways: pyruvate fermentation to butanoate ( $\beta = -4.54$ ,  $SE = 1.08$ ,  $Q = 0.028$ ) and *Clostridium acetobutylicum* fermentation ( $\beta = -4.48$ ,  $SE = 1.16$ ,  $Q = 0.026$ ).

## Conclusions

The small intestinal paracellular permeability, immune system-related markers and gut microbiota change dynamically during the first two years of life. The *Ruminococcus* (*torques* group) seems to be especially involved in controlling paracellular permeability. *Staphylococcus*, Staphylococcaceae, Ruminococcaceae, and Clostridiales, may be potential biomarkers of the immune system. Despite observed correlations their clear causation and health consequences were not proven. Mechanistic studies are required.

# Background

The intestinal barrier plays important role in the defense against infections, apart from its essential nutritional, endocrine, and immune functions.[1] Multiple factors impact intestinal permeability in infants, including gestational age, mode of delivery and feeding, and various diseases.[2] Increased gut barrier permeability allows the optimal nutrient uptake and leads to increased immune tolerance[3]; on the other hand, increased permeability to foreign antigens, including intestinal bacteria, might result in inflammation and systemic hypersensitivity.[3, 4] The gut barrier of a newborn is highly permeable; importantly, the permeability decreases during a process known as “gut closure”. [5] The exact time of this process in humans, regulated by growth factors, hormones and breast milk is unknown but has been proposed to take place around 22nd week of life.[6] It could also be hypothesized that gut microbiota may be involved in this process.[6, 7] Of note, gut permeability can be assessed via the analysis of the absorption of various substances[8], as well as via the measurement of blood and stool markers, including zonulin and calprotectin.[9]

Zonulin (ZON), an analog of the cholera comma toxin (ZOT, zonula occludens toxin) [10, 11] shown to regulate paracellular transport within the small bowel.[12–14] This protein is synthesized in the liver and epithelial cells of the intestine and is a component of multi-protein membrane complexes (claudin-occludin-guanylate kinase-like proteins ZO-1, ZO-2, and ZO-3) forming tight junctions (TJ).[15] In fact, zonulin regulates the tightness of TJ, which is an important part of the proper function of the intestinal barrier.[16] Increased zonulin concentrations correlate positively with small intestinal permeability[17], a phenomenon discovered in the context of inflammatory and autoimmune disease[18–21], and could be considered as a biomarker for systemic inflammation.[22]

Human calprotectin is a 24 kDa dimer formed by the protein monomers S100A8 (10,835 Da) and S100A9 (13,242 Da), and makes up to 60% of the soluble proteins in the cytosol of human neutrophils.[23, 24] The sources of calprotectin in newborns are breast milk and resident and non-resident myeloid cells.[25] In fact, fecal calprotectin is used in older children and adults as a marker for inflammatory bowel diseases; there is a body of evidence correlating calprotectin with inflammatory bowel diseases, cow-milk allergy, atopic disease and other gastrointestinal disorders.[26] Of note, calprotectin has the potential to be used as an indirect marker of gut permeability.[27] However, its role as a marker of inflammation was not confirmed in neonates.[25]

In our previous study[28] we found that some maternal-fetal factors are associated with increased concentration of fecal calprotectin and zonulin in children during the first two years of life. Additionally, we found that after birth, zonulin levels increased up until 12 months of age, remaining high thereafter, while calprotectin levels decreased until six months of age, stabilizing thereafter.[29] Of note, in this previous study, we did not assess the fecal microbiota, which was a significant limitation; we were not able to trace the relationships between the fecal microbiome and the concentrations of the abovementioned stool markers. Therefore, in this study, we decided to analyze the microbiota in faecal samples collected longitudinally over 24 months from 21 subjects to test the hypothesis that small

intestinal barrier permeability is linked to the gut microbiota. Moreover, we validated the observed results via comparison with the data obtained in the study by Willers et al. (Hannover Medical School - HMS cohort) who measured the relationship between calprotectin and gut microbiota in children during the first year of life.[25]

## Methods

### Subjects

The present observational prospective cohort study continues research efforts in the context of intestinal barrier function in a cohort of Polish newborns, described in detail in previous publications[28, 29]. Twenty four healthy full-term newborns at the Department of Obstetrics, Gynecology and Neonatology, the Pomeranian Medical University/Independent Public Clinical Hospital No. 2 in Szczecin (PMU cohort) were initially recruited to this study. Longitudinal sampling was performed for over 24 months. Three newborns were excluded due to an inadequate number of samples. In total, 21 newborns (101 samples in total) were included in the study, with at least four longitudinal stool samples available (the sample availability matrix is provided in Supplementary Fig. 1). Samples were taken at the following points in time - meconium (P1, n = 8), 7 days (P2, n = 20), 1 month (P3, n = 19), 6 months (P4, n = 20), 12 months (P5, n = 21) and 24 months (P6, n = 13) (Supplementary Fig. 2) after birth. The study was conducted using the results obtained for the time points P2-P6. The measured markers and the meconium microbiota composition (P1) reflect the perinatal period. Therefore the values obtained at this time point were used instead to validate the microbiota analysis (the meconium microbiota is expected to be clearly distinguishable from the microbiota obtained at other time points). The participants' characteristics are shown in Table 1.

Table 1 Characteristics of study participants

Characteristic	P1 (n = 8)	P2 (n = 20)	P3 (n = 19)	P4 (n = 20)	P5 (n = 21)	P6 (n = 13)
Sex (F/M)	4/4	9/11	10/9	9/11	10/11	8/5
Mode of delivery (C/V)	5/3	11/9	11/8	12/8	12/9	6/7
Birth weight (g)	3472 ± 507	3320 ± 548	3311 ± 518	3322 ± 550	3341 ± 543	3352 ± 582
Body weight (kg)	-	3.36 ± 0.54	4.49 ± 0.74	8.26 ± 1.18	10.40 ± 1.29	13.00 ± 1.68
Feeding method (N/F)	8/0	20/0	15/4	9/11	4/17	0/13
Breastfeeding time (weeks)	36.2 ± 25.6	30.0 ± 26.7	27.1 ± 24.9	27.9 ± 26.9	28.9 ± 26.6	27.1 ± 26.3

*Note:* C- Cesarean section, V - vaginal delivery, N - natural, F- formula; P1 - meconium, P2 - 7th day, P3 - 1st month, P4 - 6th month, P5 - 12th month, P6 - 24th month

All included newborns were exclusively breastfed during the first week of life. The children were healthy and did not take antibiotics at the time the samples were collected. For validation, we used independent Illumina MiSeq 16S rRNA data of the same hypervariable region (V3-V4) derived from 227 stool samples of healthy term children enrolled in the HMS cohort. They were tested at seven time points (1, 2, 10, 30, 90, 180 and 360 days of age). For the sake of compatibility with the PMU cohort, five time points were selected: 1 day (P1, n = 43), 10 days (P2, n = 42), 30 days (P3, n = 47), 180 days (P4, n = 43) and 360 days (P5, n = 52) of age.

## Determination of the fecal zonulin and calprotectin content

The concentrations of zonulin and calprotectin in the fecal samples were measured as previously described.[28, 29].

## Sample collection, DNA extraction and sequencing

Stool samples were collected from diapers using a standardized biological material collection kit (Stool Sample Application System (SAS); Immundiagnostik, Bensheim, Germany). The samples were collected by previously trained hospital staff or by the parents according to an established procedure and stored in a refrigerator (for a maximum of eight hours) before transport. Transport to the laboratory took no longer than 60 min, at 6–8°C. The stool samples were then frozen at – 20°C until metagenomic analyses were conducted. Microbiome DNA extraction was performed using the Genomic Mini AX Bacteria + Spin and Genomic Mini AX Soil Spin kits (A&A Biotechnology, Gdynia, Poland) following the manufacturer's protocol. DNA concentrations was determined by fluorometry (DeNovix DS-11 FX + Spectrophotometer/Fluorometer, Wilmington, DE, USA). Samples were subsequently stored at -20°C. Metagenomic libraries of the V3-V4 hypervariable region of the 16S rRNA gene were constructed and further sequenced on the MiSeq platform (paired-end 2x250 bp) using V2 chemistry from Illumina (Illumina, San Diego, CA, USA). Next generation sequencing (NGS) was performed by Genomed S.A., Warsaw, Poland.

For validation, we used the independent Illumina MiSeq 16S rRNA data of the same hypervariable region (V3-V4) derived from the 227 stool samples of healthy term children enrolled in the HMS cohort.

## 16S sequencing sample processing

The sequences were processed using LotuS 1.62.[30] LotuS clusters operational taxonomic units and generates taxonomic-level abundances tables. UPARSE *de novo* sequence clustering removed chimeric OTUs with 1470 OTUs (PMU cohort) and 923 OTUs (HMS cohort) remaining. OTU seed sequences were classified by BLAST lower ancestor comparison to SILVA (1.32). The Rarefaction Toolkit (RTK) was used to normalize the abundances on all taxonomic levels.[31] Two samples were removed due to their low number of bacterial reads from the PMU cohort (read counts of 246 and 134), resulting in a final rarefaction depth of 1117 16S reads, yielding a count of 594 genera resolved at this sequencing depth

and the final sample size of 101 was obtained. Moreover, 108 samples were removed due to their low number of bacterial reads from the HMS cohort (read count less than 1000), resulting in a rarefaction depth of 1000 16S reads, yielding 484 genera and the final sample size of 227.

The alpha diversity (Shannon, Simpson, Chao1, Evenness) was computed using RTK taking the genus median alpha diversity over ten rarefaction cycles. The beta diversity was calculated on a rarefied genus-level abundance table using the Bray-Curtis dissimilarity metrics and visualized as principal coordinate analysis (PCoA). Taxa that were present in less than 20% (PMU cohort) and 10% (HMS cohort; a lower taxa prevalence was used to allow the comparison) of samples were removed.

To predict the metabolic profile of gut microbiota, we used the PICRUSt2 tool.[32] The prediction of MetaCyc metabolic pathways was conducted on the non-rarefied OTU abundance table from which rare OTUs (present in less than 20% of samples with a minimum count of 3) were removed. In order to address the issue of compositional data, the taxa and predicted MetaCyc pathway abundances (not rarefied but filtered to match the rarefied data) were transformed by generating 128 Monte Carlo instances of the Dirichlet distribution for each gut sample, followed by center-log transformation of each instance.[33] Analyses were performed for each instance separately and the results were then averaged over 128 instances.

## Statistical analysis

Changes over time in the context of permeability biomarkers (zonulin and calprotectin), the gut alpha diversity indices, gut composition principal coordinate scores, or gut taxa and pathway abundances were analyzed using mixed-effects models. Time points (P) were treated as the fixed effect and the newborn IDs as the random effect, accounting for repeated sampling of the same individual. The significance of the time point variable was tested via comparison of the likelihoods of the two nested models (likelihood ratio test, LRT): without (null model) and with (full model) the fixed factor in question. Pairwise comparisons between timepoints were performed using the emmeans package[34] and the Benjamini-Hochberg procedure for the control of the false discovery rate (FDR). In the models with biomarkers (which were rank-transformed), taxa and metabolic pathways, the mode of delivery and breastfeeding time were also included as additional covariates and thus controlled for. The LRT p-values for taxa and metabolic pathways were FDR-adjusted as above.

The gut microbial diversity, composition and metabolic pathways were analyzed with respect to zonulin and calprotectin biomarkers using a repeated measures correlation method.[35] The repeated-measures correlation (an equivalent to the linear mixed-effects model with random intercept) was used to assess the association between the levels of the biomarkers and the alpha diversity, PCoA scores, taxa and metabolic pathway abundance, accounting for repeated measures for each participant.

In addition, an association between the differences (changes) among all time points were associated using linear mixed-effect models with random intercepts (newborn ID as a random factor). The extent of the biomarker change was defined as the dependent variable (DV). Then, the time period/interval - a

categorical variable with ten levels indicating all possible differences (e.g. P2-P3, P2-P4, etc.) between the five time points (P2, P3, P4, P5 and P6, PMU cohort) or four time points (P2, P3, P4, P5, HMS cohort)] and either beta-diversity (Bray-Curtis intersample composition distance) or univariate metrics of changes in microbiota composition or metabolic pathway abundance (between corresponding time points) were defined as fixed effects. To investigate the connection between the change in the overall compositional profile and the change in the levels of biomarkers, we took the within-subject Bray-Curtis distances (computed at the genus level using rarefied abundances). Fine-grained analysis was performed using changes in the taxonomic composition (from genus to phylum level) and metabolic pathways which were computed using the center-log transformed Monte Carlo instances of the Dirichlet distribution. Two sets of likelihood ratio tests were performed (with mode of delivery and breastfeeding time as covariates). In the first LRT, a significance of the Bray-Curtis distance or change in abundance was assessed under the assumption of no interaction between the fixed factors (the common slope model). The second LRT was used to determine whether the interaction was statistically significant. In case of a significant interaction effect, the emmeans package was used (emtrends function) to estimate the individual slopes over levels of the time period/interval. The p-values for the slopes (coefficients) were determined and adjusted for multiple testing to control for the FDR. The analysis was performed using R (<https://cran.r-project.org>). Data was manipulated using Perl. A significance level of 5% was used for raw and FDR adjusted p-values.

## Results

### **Stool levels of zonulin and calprotectin increase and decrease over time, respectively**

Both stool zonulin and calprotectin concentrations changed significantly over time in the cohort (Fig. 1, LRT,  $df = 4$ ,  $P = 2.6e-05$ , and  $df = 4$ ,  $P = 10.0e-05$ , respectively; adjusted for the mode of delivery and breastfeeding duration).

Zonulin levels at P2 (7 days after birth) and P3 (1 month after birth) were significantly lower than those at the time points P4, P5, and P6. However, from P4 to P6 (6th and 24th months of life), no significant differences were observed (between any two time points, non-consecutive or consecutive). Thus, zonulin levels tended to increase for up to 6 months after birth (P4) and stabilize thereafter (Fig. 1A). In contrast to zonulin, calprotectin levels did not differ significantly between any consecutive time points (Fig. 1B). Moreover, up to and including P4, none of the differences in calprotectin levels between any two time points (non-consecutive or consecutive) were significant. However, the calprotectin levels at P5 were significantly lower than those at P2, P3; additionally, the calprotectin levels at P6 were also significantly lower than those at P2, P3, and P4 (Fig. 1B). Overall, these results suggest that between about six and twelve months of age, the zonulin levels stabilize remaining at a high level, while calprotectin concentration begins to decline. Importantly, the analysis of the HMS validation cohort (Supplementary Fig. 3) confirmed the declining trend of calprotectin from P3 onwards; of note, a significant difference was determined between the first and sixth months of life, which altogether strongly highlights the sixth month of life as an important time point concerning changes of analyzed markers after childbirth.



Interestingly, despite the observed opposite trends in the context of stool zonulin and calprotectin levels, the two markers did not appear to correlate with each other (LRT; common slope model:  $df = 1$ ,  $P = 0.776$ ,  $\beta = 0.03$ ,  $SE = 0.09$ ; interaction model:  $df = 9$ ,  $P = 0.419$ , Fig. 1C).

## Gut microbiota diversity, taxonomy and metabolic pathways during the first two years of life

### *Gut microbiota diversity*

The alpha diversity was measured using the Shannon index (Fig. 2A); sample diversity differed significantly between time points (LRT,  $df = 5$ ,  $P = 6.61e-09$ ). Specifically, P2's alpha diversity was significantly lower than in P4, P5 and P6, whereas P3's alpha diversity was significantly lower than in P5 and P6. We have validated those results by comparing diversity in stool samples with that in meconium in the two cohorts of children (PMU and HMS). In the PMU, the Shannon indexes in P2 ( $Q < 0.0001$ ), P3 ( $Q = 0.0001$ ), P4 ( $Q = 0.004$ ) were significantly lower than that in P1; on the other hand, the Shannon indexes in P5 ( $Q = 0.109$ ) and P6 ( $Q = 0.201$ ) did not differ significantly from that. Altogether, these results indicate that the meconium samples have the highest alpha diversity; interestingly, our data suggest that the newborn's gut microbiota diversity first decreases but then is restored over time (Fig. 2A). Importantly, a similar pattern was evident in the HMS cohort data (Supplementary Fig. 4A), except for a clear discrepancy between the first samples' diversity (in the HMS cohort, the lowest diversity was detected at day 1, giving rise to a monotonically increasing trend in this cohort). This can occur if "high diversity" meconium samples (bacteria derived from the mother and environment following birth [36] are combined with early newborns' stool "low diversity" samples (in the PMU cohort, only meconium stool samples were analyzed while in the HMS cohort also the first stool samples were analyzed in some cases).

The ordination of samples in a two-dimensional space performed as per a principal coordinate (PCo) analysis on Bray-Curtis distances dissimilarity based on genus abundance showed a sequential change in the gut microbial communities (Fig. 2B), especially along the PCo2 axis, where the transition of the gut microbial composition was smooth and gradual so that the differences in the PCo2 scores were significant only between more distant time points, i.e. P2-P4/P5/P6, P3-P5/P6 and P4-P6 (Fig. 2D). The meconium community composition was markedly dissimilar from those in later samples in both cohorts. This was especially evident along the PCo1 axis (Fig. 2C, Supplementary Fig. 4C): in the PMU, the PCo1 scores were significantly different among all time points except for P4. Altogether, these results align with previous findings regarding taxonomic composition of the meconium and fecal samples [25, 36], validating the microbial analysis methods used.

### *Gut microbiota composition and functional profiles during the first two years of life*

The bacterial taxonomic and functional (PICRUSt2-predicted) development during the first two years of life was analyzed using linear mixed-effect modeling of the centered log-ratio transformed 128 Monte Carlo instances of the Dirichlet distribution in samples from 7th day (P2) to the 24th month (P6) of age.

Twenty-seven out of 47 evaluated genera that met the prevalence criterion either increased or decreased significantly during that period (Fig. 3A). Of note, the changes in the *Staphylococcus* and *Ruminococcus* (*torques* group) abundance were approximately monotonic throughout that time (Fig. 3B). In general, the abundance tended to stabilize around one year of life (P5) with only mild alterations thereafter (see the column P5P6 in Fig. 3A). Interestingly, except for *Staphylococcus*, the abundance was relatively constant until the end of the first month of life (P3, see the P2P3 column in Fig. 3A). Longitudinal changes in the bacterial composition at higher taxonomic ranks are shown in Supplementary Fig. 5.

Remarkably, fifteen genera whose abundance changed significantly over time overlapped between the PUM and HMS cohorts (Fig. 3A, Supplementary Fig. 6). This overlap accounted for 60.0% and 51.7% of the significantly affected taxa in the PMU (P2 to P6) and HMS (P2 to P5), respectively. Moreover, for overlapping genera, the patterns of temporal changes in abundance were similar (either decreasing or increasing); the degree of changes between time points also exhibited a similar pattern (i.e. P2P3, P2P4, P3P4).

To infer the functional profile of the microbial communities, we used the PICRUSt2 software. We identified 110 MetaCyc pathways (out of 332 predicted) in the PMU cohort that were significantly associated with time. In general, almost all pathways (except PWY-7332) did not change significantly in abundance after P5, and the majority of pathways stabilized even earlier at around the 6th month of age (P4). In the HMS cohort, the analysis of predicted MetaCyc pathways revealed 223 pathways (out of 290 predicted) whose abundance changed significantly over the observation period (P2 to P5). Importantly, there were 76 pathways whose abundance changed over time in the two cohorts (Supplementary Fig. 7), accounting for 75.2% and 34.1% of the significant pathways in the PMU and HMS cohorts, respectively. Remarkably, there was a very high degree of consistency between the cohorts regarding the direction and dynamics of the pathways' abundance.

## **Gut microbiota diversity, composition and metabolic pathways concerning the stool levels of zonulin and calprotectin**

Next, we focused on the relationships between microbiota diversity, composition, predicted function and permeability/inflammatory markers. In a first step, we assessed whether the time intervals with significant changes in bacterial diversity, abundance and predicted metabolic functions overlapped with the time intervals associated with an increase in zonulin (i.e. P2-P4/P5/P6, P3-P4/P5/P6) and decrease in calprotectin (i.e. P2-P5/P6, P3-P5/P6, P4-P6). Then, in a second step, we used a statistical technique (repeated measures correlation) that accounts for non-independence among observations comprising the entire observation period (from P2 to P6), to investigate the associations between the bacterial diversity, abundance and predicted metabolic functions and the concentration of zonulin or calprotectin. In a third step, mixed effects linear models were used to investigate the relationship between changes in bacterial

diversity, abundance and metabolic function and the corresponding changes in the concentration of zonulin and calprotectin between all time point pairs.

The compatibility of observations obtained at all stages of the analysis was considered as potential evidence of a causal relationship between the microbiota and the markers analysed. To make this analysis easier accessible, these data are included in summary tables (Supplementary table 5).

## Diversity

The Shannon index increased significantly in five out of six time intervals associated with a significant increase in zonulin (i.e. P2-P4/P5/P6, P3-P5/P6, Fig. 1A, Fig. 2A) and in four out of five time intervals associated with a significant decline in calprotectin (P2-P5/P6, P3-P5/P6, Fig. 1B, Fig. 2A). To investigate whether or not a relationship exists between the alpha diversity and stool zonulin/calprotectin levels, we performed correlation analysis between four alpha-diversity indices (Shannon, Simpson, Chao1, Evenness) and the levels of these biomarkers using repeated measures correlation. The zonulin levels did not correlate with any of the alpha diversity indices (after FDR adjustment). In contrast, the levels of calprotectin inversely correlated with all of the alpha diversity indices calculated (Shannon's -  $r = -0.30$ ,  $Q = 0.039$ ; Simpson's -  $r = -0.23$ ,  $Q = 0.048$ , Chao1 -  $r = -0.24$ ,  $Q = 0.048$ , Evenness -  $r = -0.24$ ,  $Q = 0.048$ ); of note, the strongest correlation was found for the Shannon's diversity (Fig. 4A).

The PCo2 scores decreased significantly in five out of the six time intervals associated with a significant rise in zonulin (P2-P4/P5/P6, P3-P5/P6, Fig. 1A, Fig. 2D) and in all five time intervals associated with a significant decrease in calprotectin (P2-P5/P6, P3-P5/P6, P4-P6, Fig. 1B, Fig. 2D). Besides, there was some similarity between the longitudinal zonulin and PCo1 scores pattern (Fig. 1A, Fig. 2C). Therefore, we explored the correlations between the zonulin and calprotectin levels and the per-sample positions on the first two PCoA axes using repeated measures correlation analysis. We did not find any significant correlation (zonulin and PCo1:  $r = 0.06$ ,  $P = 0.637$ ; zonulin and PCo2:  $r = -0.23$ ,  $P = 0.053$ ; calprotectin and PCo1:  $r = 0.11$ ,  $P = 0.363$ ; calprotectin and PCo2:  $r = 0.19$ ,  $P = 0.109$ ) suggesting that the overall compositional profiles (captured by the first two PCo dimensions) were not associated with the levels of zonulin or calprotectin (Fig. 4B, C). Moreover, using likelihood ratio tests of the nested models, no association between Bray-Curtis distances and the changes in the zonulin levels was found (non-interaction model:  $df = 1$ ,  $P = 0.121$ ,  $Q = 0.241$ ; interaction model:  $df = 9$ ,  $P = 0.965$ ,  $Q = 0.965$ ). However, there was a significant association between the Bray-Curtis distances and the changes in calprotectin levels (time period x calprotectin change interaction model:  $df = 9$ ,  $P = 0.013$ ,  $Q = 0.025$ ). The post-hoc tests revealed significant correlations between the changes in calprotectin levels and the Bray-Curtis distances for P2-P3 and P3-P4; however, they were not significant after FDR adjustment ( $Q = 0.216$  and  $Q = 0.110$ , respectively, Fig. 4D).

## Microbiota composition and functional profiles concerning stool zonulin and calprotectin

Despite the lack of associations between alpha diversity and the zonulin levels as well as between beta diversity and the levels of both biomarkers (zonulin and calprotectin) (Fig. 4), we sought to examine more particular relationships between the levels of these permeability/inflammation-associated biomarkers and the abundances of specific gut bacterial taxa in the context of five taxonomic ranks (from genus to phylum levels) as well as the PICRUSt2-predicted MetaCyc metabolic pathways.

Interestingly, the changes in abundance of several bacteria coincided with significant time dependent changes in the levels of zonulin or calprotectin (Fig. 1, Fig. 3A). For example, there was an increase in the abundance of *Lachnoclostridium*, *Ruminococcus* (*gnavus* group), Carnobacteriaceae, Lachnospiraceae, Peptostreptococcaceae, Coriobacteriales, and a decrease of Corynebacteriales among all time points associated with an increase in the zonulin concentration. Additionally, there was an increase in the abundance of *Anaerostipes* and a decrease in the abundance of Enterococcaceae among all time points associated with a decrease in calprotectin concentration. To investigate this further, we computed the repeated measures correlations (encompassing the whole study period; Fig. 5 and Supplementary Table 5) between the levels of both markers and the gut microorganisms.

In the correlations between gut microorganisms and stool calprotectin, we observed significant associations at the genus level (n = 3), the family level (n = 3), and the order level (n = 1). Moreover, the levels of zonulin were correlated with the abundance of 19 microorganisms: at the genus level (n = 5), at the family level (n = 5), at the order level (n = 5) and the class level (n = 4) (Fig. 5A and Supplementary Table 1). Specifically, calprotectin correlated positively with *Staphylococcus*, *Enterococcus*, Staphylococcaceae, and Enterococcaceae and negatively with *Anaerostipes*, Ruminococcaceae and Clostridiales, whereas zonulin correlated positively with *Lachnoclostridium*, the *Ruminococcus gnavus* group, the *Ruminococcus torques* group, Lachnospiraceae, Peptostreptococcaceae, Ruminococcaceae, Erysipelotrichales, Coriobacteriales, Clostridiales, Clostridia, Coriobacteria and negatively with *Staphylococcus*, *Corynebacterium*, Moraxellaceae, Staphylococcaceae, Bacillales, Pseudomonadales, Alphaproteobacteria, and Bacilli. Of note, the genus *Staphylococcus*, the families Ruminococcaceae and Staphylococcaceae, and the order Clostridiales were simultaneously and oppositely correlated with both biomarkers in the PMU cohort (Fig. 5A) and with calprotectin in the HMS cohort, exhibiting the same direction and similar magnitudes as those in the PMU cohort (Supplementary Table 2). Additionally, zonulin correlated significantly with 10 MetCyc pathways belonging to 4 superclasses (Superpathways: FUC-RHAMCAT-PWY, Degradation/Utilization/Assimilation: FUCCAT-PWY, PWY-6353, PWY-7237, SALVADEHYPOX-PWY, Generation of Precursor Metabolites and Energy: PWY-5676, PWY-5677, PWY-6588, PWY-7003, and Biosynthesis: PWY-6478), of which two pathways, PWY-5677 and PWY-6588, were the only pathways associated with calprotectin (Fig. 5B). The correlation between calprotectin and predicted metabolic pathways from the HMS cohort revealed 15 pathways significantly correlating with calprotectin levels; however, none of them overlapped with the correlations found in the PMU cohort (Supplementary Table 2).

In order to gain more insight into the causal relationship between the microbiota and zonulin/calprotectin, the changes in the gut community features (taxonomic composition and functional profile) and the

changes in the levels of zonulin or calprotectin among the time points were correlated using a linear mixed-effects model. We did not find any association between changes in microbiota and changes in markers, except for the genus *Ruminococcus* (*torques* group) which was significantly associated with the changes in levels of calprotectin. Of note, while the slopes differed between time point pairs suggesting an interaction between the time point interval and the *Ruminococcus* changes (e.g. a positive slope for P2-P4 and a negative slope for P4-P5, Fig. 6B), the interaction model (LRT, df = 9, P = 0.424, Q = 0.910) did not fit significantly better than the common (positive) slope model (LRT, df = 1, P = 0.002, Q = 0.015,  $\beta$  = 2.94, SE = 0.81, Fig. 6A). Thus, the abundance of *Ruminococcus* (*torques* group) changes in parallel with the changes in stool calprotectin levels regardless of time interval, thereby suggesting that both can be causatively connected. However, this observation was not confirmed in the validation analysis and must be taken with caution. The analysis in the context of higher taxonomic ranks for the PMU and HMS cohorts are shown in the Supplementary Figs. 8–10.

In addition to the changes in the composition of the human gut microbiota, we also investigated whether the changes in functional profiles of gut microbiota were linked to the dynamics of the zonulin or calprotectin levels. Remarkable, we found that the dynamics of stool calprotectin was negatively associated with changes in two MetaCyc metabolic pathways: pyruvate fermentation to butanoate (CENTFERM-PWY) and the superpathway of *Clostridium acetobutylicum* acidogenic fermentation (PWY-6590) (Fig. 7C, D). The common slope model was the best fit for these pathways and the regression coefficients were  $\beta$  = -4.54, SE = 1.08, LRT: df = 1, P = 0.0002, Q = 0.028 and  $\beta$  = -4.48, SE = 1.16, LRT: df = 1, P = 0.0002, Q = 0.026, respectively. For zonulin, the common slope model was the best fit for a change in the pentose phosphate pathway (PENTOSE-P-PWY) only ( $\beta$  = 9.49, SE = 1.93, LRT: df = 1, P = 3.98e-6, Q = 0.001, Fig. 7A). In addition, the dynamics of zonulin was associated with changes in 3 MetaCyc pathways: pyrimidine deoxyribonucleotides *de novo* biosynthesis III (PWY-6545), the superpathway of glucose and xylose degradation (PWY-6901), and the super pathway of pyridoxal 5'-phosphate biosynthesis and salvage (PWY0-845). For those 3 pathways, as illustrated in Fig. 7B for PWY-6545, the models with different slopes (i.e. including an interaction between all time point pairs and pathway changes) fitted the data significantly better than the common slope model. For example, the change in zonulin levels was associated negatively with a change in PWY-6545 (LRT, df = 9, P = 4.15e-5, Q = 0.014) between P3 and P4 ( $\beta$  = -8.46, SE = 2.58, P = 0.001, Q = 0.012), yet positively between P4 and P6 ( $\beta$  = 12.36, SE = 4.08, P = 0.003, Q = 0.012) as well as P5 and P6 ( $\beta$  = 10.09, SE = 3.41, P = 0.004, Q = 0.012, Fig. 7B). For the other two pathways, PWY-6901 (LRT, df = 9, P = 0.0005, Q = 0.046), and PWY0-845 (LRT, df = 9, P = 0.0008, Q = 0.049), significant associations were found between P3 and P4 ( $\beta$  = 23.60, SE = 7.35, P = 0.002, Q = 0.008) as well as P5 and P6 ( $\beta$  = 36.08, SE = 10.56, P = 0.0008, Q = 0.008) for PWY-6901, and between P3 and P4 for the PWY0-845 ( $\beta$  = 13.07, SE = 3.66, P = 0.0005, Q = 0.005). For the full results, see Supplementary Tables 3 and 4.

However, it should be noted that the above results (concerning calprotectin) were not confirmed in the HMS cohort: 44 pathways showed a correlation with the dynamics of calprotectin (all under the common slope model), but the CENTFERM-PWY (P = 0.051, Q = 0.131) and PWY-6590 (P = 0.056, Q = 0.140) did not

(Supplementary Fig. 11). The relationships between the changes in abundance in the gut, the MetaCyc pathways, and the changes in calprotectin levels in the HMS cohort are shown in Supplementary Fig. 12.

## Discussion

This is the first study in which putative associations between the gut microbiota and the concentrations of zonulin and calprotectin in children's stool during the first two years of life have been investigated. The study of zonulin allows the non-invasive assessment of the functional state of the small intestinal paracellular permeability; additionally, the calprotectin measurements provide insight into the development of the immune system after birth. The observed results indicate that small intestinal paracellular permeability measured based on zonulin concentration is higher in the period from the sixth month to the second year of life than in the first months of life. In line with this, the concentration of calprotectin in stool in the first and second years of life is lower than that in the first months of life; of note, the concentration of calprotectin at six months of age does not differ significantly from that in the previous or later adjacent time points. Since the validation data also revealed a difference in the concentration of calprotectin between the first and sixth months of life, this allows us to define the 6th month of life as the key point for forming the small intestinal barrier and for the development of postnatal immunity. It should also be stressed that, usually, in the sixth month of life, solid food is introduced to children's diet, which can significantly impact both gut microbiota and intestinal permeability.

Although zonulin seems to be a valuable marker of small intestinal paracellular permeability, the data in the context of children aged two years old or younger are scarce. Tarko et al.[37] reported significantly higher blood zonulin concentrations in children with gut wall defects and infected with rotaviruses. Saleem et al.[38] observed that the blood zonulin levels were significantly lower in children delivered before 28 weeks of pregnancy. The fecal zonulin concentration in children during first two years of life was not reported and its role during this period is unknown. Its relationship with gut microbiota seems to be interesting.[38] Zonulin is involved in controlling the passage of molecules weighing at least 3.5 kDa [39] through the intestinal barrier via its reverse influence on TJ tightness.[40, 41] After the activation of zonula occludens (ZO) 1, zonulin controls the low-capacity "leak" type route characterized by low selectivity.[42, 43] Interactions between zonulin and gut microbiota can be bidirectional. Bacterial and gluten exposure was defined as intensive triggers of zonulin release.[19, 44] Of note, the zonulin pathway is an innate defensive mechanism of the host, able to control the gut microbiome composition via the "flushing out" of microorganisms by water secreted into the intestinal lumen following hydrostatic pressure gradients.[45] High stool zonulin levels suggest that the gut barrier allows the free flow exchange of various particles in infants. Moreover, it is likely that the commercially available ELISAs detect one or more members of the zonulin family that have not been discovered yet but play some important role during the first two years of life.[46]

High levels of calprotectin in feces during the first months of life are associated with the regulation of the development of the immune system in neonates as well as with the adaptation to new environmental

conditions.[25] The decrease in the fecal calprotectin concentration implies that inflammatory processes in the gut tend to decrease from the sixth month of age, which, with the accompanying increased paracellular intestinal permeability and bacterial alpha diversity, provides evidence of immune tolerance. Willers et al. [25] demonstrated that mice exposed to calprotectin immediately after birth induced microbial tolerance against the first wave of microbial colonization; on the other hand, the same exposure after the neonatal period was associated with pro-inflammatory responses. Our results did not fully corroborate these observations. The intestinal permeability in the first month of life, as per the zonulin concentration, is lower than that in the later period, suggesting that the possibility of antigen translocation early after birth is limited. After the sixth month of age, the intestinal paracellular permeability increases, but this does not increase inflammation, as per the calprotectin concentration, which indicates the development of immune tolerance. The differences between the two studies may be due to the fact that Willers et al. did not directly measure intestinal permeability and additionally used an animal model that does not closely mimic the timing of human intestinal barrier development. Moreover the role of paracellular way in translocation of bacteria and endotoxin is still the subject of debate[22], what requires that the observed results should be interpreted with caution.

In summary, the increased production of zonulin may be caused by changes in intestinal bacteria and by the introduction of gliadin into the diet. In contrast, the decrease in the calprotectin content in the stool may indicate immunological tolerance development. However, it should be remembered that breast milk is an essential source of calprotectin, which can significantly influence the fecal calprotectin content. This said the observed changes cannot be explained solely by environmental factors as zonulin decreases in the later years of life despite the constant consumption of gliadin. Therefore, in the context of longitudinal analyses of biomarker trajectories, we applied corrections for the time of breastfeeding and the type of delivery to minimize the influence of these confounders. To help resolve the mechanisms underlying our results, we decided to analyze whether a cause-effect relationship between the microbiota and the biomarkers would be observed. Of note, the microbial changes in the first two years of life are very dynamic and depend on the mode of delivery, feeding, antibiotic treatment, and other environmental factors.[28, 29] However, a comprehensive analysis of all factors influencing the gut microbiota is beyond the scope of this study, which is focused on the relationship between the microbiota and the fecal zonulin and calprotectin content. This said the compositional and functional comparison of the PMU and HMS cohorts' microbiota would be very interesting.

The Shannon index (more sensitive to species richness), shared 5 and 4 significant time intervals with zonulin (increasing) and calprotectin (decreasing), respectively. Similar results were observed for coordinates of the first two axes in the context of a principal coordinate analysis based on the Bray-Curtis distance, one of beta-diversity measures. However, it translated only into a negative correlation between alpha-diversity indices, the Shannon index in particular, and calprotectin. This negative correlation may be associated with the development of immunological tolerance. The microbial colonization of the intestine after birth will generate a diversity of new antigens that will play an important role in the stimulating of epithelial function and the establishing the offspring's immune system.[47] Of note, weaning (the average breastfeeding time in our study was about 30 weeks), and the resulting loss of milk-borne calprotectin,

slgA and other anti-microbial factors, along with the transition from mothers' milk to a complex diet (including solid food), can have a major impact on the dynamic microbiota development, and thus in the resulting immune responses during the neonatal period.[6]

Willers et al. [25] reported that the gut microbiota's overall diversity significantly increases during the first year of life, similarly to what we observed in this study. Moreover, they observed the increased abundance of the bacterial classes Actinobacteria, Bacteroidia [48–50] and Clostridia, along with the decreased abundance of Bacilli and Gammaproteobacteria over the same time period. Of note, Willers et al.[25] demonstrated that during infancy, high abundance of Actinobacteria and low abundance of Gammaproteobacteria are linked to high fecal calprotectin levels; additionally, at the family level, fecal calprotectin promoted the higher abundance of Bifidobacteriaceae and the reduction of Enterobacteriaceae via the production of acetate[51]. Taxonomic composition observed by Willers et al. [25] might be linked to the elevation in the synthesis and reduction in the degradation of short-chain fatty acids (SCFAs) and therefore leading to the overrepresentation of health-promoting gut microbiota metabolic functions. Our results confirm the observations obtained by Willers et al.[25] in terms of abundance; however, the correlations in the cited study were not reproduced here. Importantly, the observed differences may depend on the difference between the investigated populations (Polish and German) or/and the analytical methods used. This said the analysis of both data-sets showed similarities with respect to the correlation between the levels of calprotectin and bacteria at the family level.

Interestingly, the bacteria associated with zonulin and calprotectin (Supplementary Table 5) may be involved in the production of SCFA, which is a protective factor in the context of intestinal barrier integrity and of inflammatory processes. Particularly, the different taxonomic groups of bacteria within the class Clostridia were associated with increased zonulin and decreased calprotectin concentrations. Within this class, the family Ruminococcaceae was more abundant in women with low zonulin concentrations in a previous study; however, here, we observed the opposite pattern. Importantly, not all bacteria within this class have the same properties. For instance, the genus *Ruminococcus* (*gnavus* group) – positively correlated with fecal zonulin concentration, is increased in patients with IBS-D and Crohn's disease, which suggests its pro-inflammatory activity. An interesting result was obtained in the case of the *Ruminococcus* (*torques* group). *Ruminococcus torques*, a butyrate producer, have been found to dominate patients' gut milieu with Crohn's Disease.[52, 53] They were also studied in the context of individuals with increased risk of upper gastrointestinal tract involvement, but with inconclusive results. [54–56] Importantly, *Ruminococcus torques* are able to utilize mucin in the human intestine, sustaining their adaptability to the human intestinal environment.[53, 57, 58] Consequently, increased mucin degradation makes luminal antigens cross the gut barrier and stimulate the immune system, leading to intestinal disorders.[59] Of note, in this study, the abundance of these above bacteria positively correlated with the concentration zonulin and the dynamics of calprotectin concentration. Therefore, bacteria from the *Ruminococcus* (*torques* group) may include species associated with small intestinal permeability and immune responses in the first two years of life. For deeper species resolution and assessment of the gut



functional potential future shotgun metagenomics, metabolomics, and immune analyses will be essential.

In this study, the Bacilli class correlated with decreased zonulin and increased calprotectin levels. In general, this class is considered beneficial for gut health, which is in line with decreased zonulin levels. On the other hand, the family Staphylococcaceae and genus *Staphylococcus* from the Bacilli class are the most prominent bacteria in human milk, an important calprotectin source in the infant. Family Enterococcaceae belongs to opportunistic pathogens, considered as potential marker for IBD what can explain correlation with increased fecal calprotectin concentration. However, our present results do not allow consistent conclusions on the role of bacteria in the small intestinal barrier's permeability or the immune system in the first two years of life. For example, the *Lachnospirillum* genus produces SCFAs and occurs in lower amounts in patients with gastrointestinal cancers; therefore, in theory, it should decrease intestinal permeability; however, it was correlated with increased concentrations of zonulin in the neonatal stool in this study. Alphaproteobacteria occur in high numbers in patients with IBD and are negatively associated with the concentration of zonulin. The order Corynebacteriales is associated with decreased zonulin and belongs to the class Actinobacteria, which was positively correlated with calprotectin in the study by Willers et al.[25] The order Pseudomonadales and the family Moraxellaceae are negatively correlated with zonulin and belong to Gammaproteobacteria, negatively correlated with calprotectin in the study by Willers et al. Therefore, in no case was there a full consistency of microbiota changes between particular time points and changes in the levels of zonulin and/or calprotectin. This said the validation analysis suggested that the genus *Staphylococcus* and the family Staphylococcaceae (positively correlated with the concentration of calprotectin), as well as the family Ruminococcaceae and the order Clostridiales (negatively correlated with the concentration of calprotectin), are potential candidates as markers of the development of the immune system in children under two years of age.

Finally, we analyzed the metabolic pathways linked with bacterial abundance (Supplementary Table 6). We were able to show that the pathways involved in the production of SCFAs and the metabolism of carbohydrates were positively associated with fecal zonulin and negatively with calprotectin. The latter association suggests the role of SCFA in the immune response. However, the positive associations and correlations between pathways involved in SCFA production and the zonulin elevation are difficult to explain, suggesting that other mechanisms are also involved in regulating small intestinal barrier permeability in children of up to two years old. It should be emphasized that the variations in the concentrations of zonulin and calprotectin overlapped with the introduction of new foods to the child's diet around the sixth month of life (addition of soup, grated apple), with the consequent alteration in the gut microbiota composition and the related metabolic functions. For example, metabolic pathways involved in the metabolism of carbohydrates, vitamin B6 and nucleotides positively correlated with the levels of zonulin, which could suggest that an "open" small intestinal paracellular permeability could play a role in the transportation of metabolic reaction products during intensive growth and development. However, the paracellular transport of nutrients is known to play a rather minor role. The observed results support the concept that paracellular permeability is only the component of intestinal barrier[22] and that SCFAs affect mostly transcellular route via metabolism of enterocytes. Of note, the analysis of the

validation data did not confirm our observations concerning the metabolic pathways. Therefore, shotgun sequencing and metabolomic analyses should be performed to shed more light on these processes.

Our study is not without limitations. Our cohort was relatively small, though enough to observe changes in zonulin and calprotectin levels as well as in gut microbiota composition during the first two years of life with appropriate power. Of note, our results were validated using the HMS cohort as well as via the comparison between the microbiota of meconium and stool samples collected at other time points. Moreover, our samples were somewhat heterogeneous (with respect to the delivery mode, the use of antibiotics, nutrition, and other environmental factors). Of note, all of these factors can affect the gut microbiota; however, in term infants, the mode of delivery seems to impact fecal calprotectin levels only in the first week of life.[25] Moreover, in our study, we did not use direct methods to measure the gut permeability; we used biomarkers, for which data in healthy children < two years old are limited. In fact, there are studies reported on the fecal levels of zonulin in adults but not in children. It is known that in children, the levels of zonulin and calprotectin are incomparably higher than those in adults, changing over time, and could be influenced by e.g., breastfeeding, the dietary patterns, the mode of delivery, and the consumption of gliadin. In the current study, however, due to the small sample size, we did not analyze these biomarkers separately in the context of different delivery modes. Also, we did not collect detailed data on antibiotic exposure. Further, we did not measure these factors in blood (ethical reason - healthy children); only in stool. Moreover, since no metabolomic, immunological, or shotgun metagenomic analyses were performed, the results we obtained must be treated with caution. Mechanistic studies are still needed to investigate the relationship between microbiota and gut permeability and the immune system.

## Conclusions

Overall, based on the results, we can conclude that the gut microbiota composition, the small intestinal paracellular permeability, as well as immune system-related markers change dynamically during the first two years of life. Although the gut microbiota composition and the related metabolic functions were correlated with zonulin and calprotectin levels, neither clear causation nor obvious health consequences can be proven in this study. However, our data may suggest that the *Ruminococcus (torques)* group might be more involved in controlling paracellular permeability during the first two years of life than previously considered. Additionally, our data indicate that the genus *Staphylococcus* and the family Staphylococcaceae (positively correlated with the fecal calprotectin concentration) and the family Ruminococcaceae, as well as the order Clostridiales (negatively correlated with the fecal calprotectin concentration), may be potential biomarkers of the development of the immune system development or inflammatory reactions in children younger than two years old. It must be emphasized that further longitudinal studies are required to investigate the mechanism behind gut permeability in children and its influence on health. The establishment of gut permeability markers optimal for children as well as of germ-free animal models, together with metabolomic studies (including the analysis of SCFAs), are essential.

# Abbreviations

DV - Dependent Variable; FDR

False Discovery Rate; HMS - Hannover Medical School, IBS-D - Irritable Bowel Syndrome (Diarrhea); LME - Linear Mixed-Effects Analysis; LRT - Likelihood Ratio Test; NGS - Next Generation Sequencing, OUT - Operational Taxonomic Unit; P - Time Point, PICRUST1 - Phylogenetic Investigation Of Communities By Reconstruction Of Unobserved States 2; PMU - Pomeranian Medical University; RMC - Repeated Measures Correlation; RTK - Rarefaction Toolkit; SAS - Stool Sample Application System; Scfas - Short Chain Fatty Acids; TJ - Tight Junctions, ZON - Zonulin, ZOT - Zonula Ocludens Toxin.

# Declarations

## Ethical Statement

This study was approved by the Bioethics Committee of the Pomeranian Medical University (Resolution No. KB-0012/55/14; 30.06.2014) and was conducted in accordance with the Declaration of Helsinki (2013).

## Consent for publication

Written informed consent was obtained from the participants' guardians (parents). All authors gave their consent to publish the study.

## Availability of data and materials

The datasets used and/or analysed during the current study are available from the corresponding author on reasonable request. Data for validation were downloaded from [www.ncbi.nlm.nih.gov/sra](http://www.ncbi.nlm.nih.gov/sra) (BioProject accession number PRJNA514340).

## Competing interest

Igor Łoniewski and Wojciech Marlicz are probiotic company shareholders. Karolina Skonieczna-Żydecka and Mariusz Kaczmarczyk - receive remuneration from a probiotic company. The other authors declare no conflict of interest.

## Authors' contributions

Conception and design of study; acquisition of data; analysis and/or interpretation of data: Mariusz Kaczmarczyk, Ulrike Löber, Karolina Adamek, Dagmara Węgrzyn, Damian Malinowski, Karolina Skonieczna-Żydecka, Igor Łoniewski, Lajos Markó, Thomas Ulas, Sofia K. Forslund, Beata Łoniewska. Drafting the manuscript; revising the manuscript critically for important intellectual content: Mariusz Kaczmarczyk, Ulrike Löber, Karolina Skonieczna-Żydecka, Igor Łoniewski, Lajos Markó, Thomas Ulas, Sofia K. Forslund, Beata Łoniewska. Approval of the version of the manuscript to be published:

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## Funding

The research was funded by the Pomeranian Medical University in Szczecin, Poland; project no. WLS 237-03/A/14

## Acknowledgements

The authors would like to thank Professor Dorothee Viemann for constructive feedback of the manuscript.

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