

Characterization of Inflammatory Bowel Disease Heterogeneity Using Serum Proteomics: A Multicenter Study

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Abstract

Background: Recent genetic and transcriptomic data highlight the need for improved molecular characterization of inflammatory bowel disease (IBD). Proteomics may advance the delineation of IBD phenotypes since it accounts for post-transcriptional modifications.

Aims: We aimed to assess the IBD spectrum based on inflammatory serum proteins and identify discriminative patterns of underlying biological subtypes across multiple European cohorts.

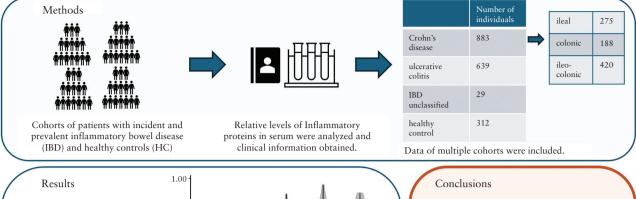
Methods: Using proximity extension methodology, we measured 86 inflammation-related serum proteins in 1551 IBD patients and 312 healthy controls (HC). We screened for proteins exhibiting significantly different levels among IBD subtypes and between IBD and HC. Classification models for differentiating between Crohn's disease (CD) and ulcerative colitis (UC) were employed to explore the IBD spectrum based on estimated probability scores.

Results: Levels of multiple proteins, such as interleukin-17A, matrix metalloproteinase-10, and fibroblast growth factor-19, differed (fold-change >1.2; false discovery rate <0.05) between ileal versus colonic IBD. Using multivariable models, a protein signature reflecting the IBD spectrum was identified, positioning colonic CD between UC and ileal CD, which were at opposite ends of the spectrum. Based on area under the curve (AUC) estimates, classification models more accurately differentiated UC from ileal CD (median AUCs > 0.73) than colonic CD (median AUCs < 0.62). Models differentiating colonic CD from ileal CD demonstrated intermediate performance (median AUCs: 0.67–0.69).

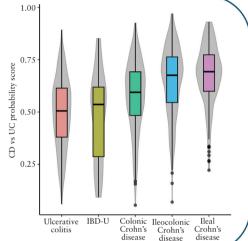
Conclusions: Our findings in serum proteins support the presence of a continuous IBD spectrum rather than a clear separation of CD and UC. Within the spectrum, disease location may reflect a more similar disease than CD versus UC, as colonic CD resembled UC more closely than ileal CD.

Key Words: Crohn's disease; ulcerative colitis; disease location; serum proteins; Montreal classification; biomarkers

Graphical Abstract



- Based on Crohn's disease (CD) vs ulcerative colitis (UC) logistic regression we obtained estimates indicating an IBD spectrum with colonic CD between ileal CD and UC.
- Compared to HC, levels of 30 proteins differed in all IBD subtypes, and additionally 15 proteins differed in at least one IBD subtype.



- We observed an overlap of significant proteins when comparing IBD subtypes with healthy controls.
- Based on serum proteins, differences were most pronounced between ileal CD and UC, with colonic CD as an intermediate subtype. Important proteins in the model, shaping the observed IBD spectrum were MMP-10, IL-10, FGF-19 and IL-17A.

1. Introduction

Inflammatory bowel disease (IBD) is an umbrella term for chronic inflammatory disorders of the gastrointestinal tract, with Crohn's disease (CD) and ulcerative colitis (UC) as the 2 main phenotypes, and with IBD-unclassified (IBD-U) as an entity for patients with features of colonic IBD but in whom no further distinction can be made. 1,2 In addition, there is no single CD or UC phenotype, as both entities are characterized by a broad heterogeneity with differences in clinical presentation.3 To account for this heterogeneity, classifications have been developed to stratify patients. The original Vienna classification4 was followed by the Montreal classification, which stratifies patients by location, behavior, and age at diagnosis in CD, as well as by extent of inflammation in UC.5 However, current classifications do not capture the heterogeneity faced in daily clinical practice and, therefore, need to be further refined.6

Despite clinical and potentially underlying pathophysiological differences within each diagnostic entity, all CD and UC patients are combined in randomized clinical trials per disease entity, not taking the heterogeneity and different subphenotypes into account. ^{7,8} This lack of adequate stratification may contribute to challenges in optimized therapeutic strategies. Consequently, improved molecular profiling of IBD phenotypes is needed. Some studies support the separation in subphenotypes, where genetic and transcriptomic data suggest an IBD continuum with ileal CD and UC at both extremes. ⁹⁻¹² By calculating genetic risk scores, Cleynen et al. introduced this continuum concept with colonic CD in between UC and ileal CD. ¹¹ Based on accumulating data findings in IBD, an

emerging perspective suggests the need to redefine the traditional classification. ^{6,9} However, a disease classification based on only single nucleotide polymorphisms does not account for post-transcriptional modifications or environmental and lifestyle influences. Analyses of serum proteins could provide additional insights into the underlying inflammatory mechanisms and help delineate various IBD subphenotypes. Therefore, the aim of this study was to analyze inflammatory serum proteins from multiple European cohorts of patients with different disease duration, activity, and treatment exposures, to delineate the heterogeneity of the spectrum of IBD and identify discriminative patterns linked to underlying molecular subtypes.

2. Methods

2.1. Study design

The Collaborative IBD Biomarker Research Initiative (COLLIBRI) aims to enable IBD biomarker research with larger sample sizes by combining existing datasets of multiple centers. Here, we conducted a cross-sectional study to investigate molecular subgroup-specific patterns from existing datasets derived from patients with IBD and healthy controls (HC).

2.2. Patient cohort

Cohorts within the consortium with pre-existing protein data generated using the Olink inflammation panel (Olink Proteomics) were included.¹³ IBD diagnosis was based on internationally accepted criteria, following thorough clinical,

microbiological, endoscopic, histological, and radiological evaluation in all cohorts. ¹⁴ Phenotypes were defined using the currently established Montreal classification. ⁵ We included data of patients and controls from several different cohorts, including 2 cohorts of patients with prevalent IBD at Örebro University Hospital, Sweden (n = 446), the Swedish Inception Cohort (n = 320), and the Swedish cohort of patients starting biological treatment (n = 245), comprising samples from 7 centers in Sweden, and also from KU Leuven, Belgium (n = 852). Further details about these cohorts are available in Supplementary Table 1.

2.3. Ethical approval

The study was approved by the regional ethics committee/The Swedish Ethical Review Authority (Dnr 2010/313, 2011-01-12; amendments Dnr 2010/313/1, Dnr 2010/313/2, Dnr 2010/313/3, Dnr 2010/313/4 (Dnr 2020-03547), Dnr 2022-03231-02, Dnr 2023-01901-02, 2023-02919-02, Dnr 2024-04489-02) and by the Ethical Committee of the University Hospitals of Leuven (B322201213950/S53684). Informed consent was obtained from all participants at inclusion in the study.

2.4. Protein analysis

Serum samples were analyzed using the Proseek Multiplex Inflammation I Probe kit 96 × 96 (Olink Bioscience, Uppsala, Sweden), including 92 inflammation-related proteins as previously described in detail. Data normalization and standardization were performed using the Olink Wizard for GenEx (Multid Analysis, Sweden). In these steps, the Ct values of the qPCR were transformed into the arbitrary unit, Normalized Protein eXpression (NPX), which represents the relative protein levels on the log2 scale. ¹⁵

2.5. Data preprocessing

The data used in this study were generated prior to this project and were obtained from different cohorts and runs. Therefore, adjustments for batch effects were necessary, and these adjustments are described in the Supplementary Material. Samples that did not pass the quality check based on Olink's quality criteria were excluded. The proteins Cluster of Differentiation 8a (CD8A) and brain-derived neurotrophic factor were not available in all batches due to changes in the Olink Inflammation panel over time and were therefore omitted from the analyses. Furthermore, tumor necrosis factor (TNF) and interferon-gamma (IFN-gamma) assays were changed over time, and these 2 proteins were also excluded. In addition, 3 proteins with >90% values below the limit of detection were excluded: interleukin (IL)-1 alpha, IL-22 receptor alpha 1 (IL-22RA1), and IL-33.

2.6. Data analysis

Data analyses were performed using R,¹⁶ version 4.05, and relevant packages as listed in the Supplementary Material. Continuous clinical data and data on an ordinal scale are presented as median and range or interquartile range (IQR), and differences were tested with the Mann–Whitney *U*-test, 2-sided, with a significance level of 0.05 and nominal *p*-values reported. Categorical data are presented as frequencies and were compared using the chi-square test.

Principal component analysis (PCA) and Uniform Manifold Approximation and Projection (UMAP) were used to identify potential subgroups of patients with IBD based on the results of the inflammatory serum proteome.

Univariate pairwise comparisons of subgroups were performed using Welsh t-tests, followed by the calculation of Benjamini–Hochberg's false discovery rate (FDR) values to control for multiple testing. ¹⁷ The log2-fold-change values for all pairwise group comparisons were calculated. A threshold of FDR < 0.05 and an absolute fold-change threshold of 1.2, or log2-fold-change of log2(1.2), was chosen, similar to the approach previously described. ¹⁸ For robustness, we repeated these analyses, adjusting for age, sex, and disease duration, as described in the Supplementary Material. Only individuals without previous IBD-related surgery were included in these adjusted analyses to account for potential differences due to surgery.

In line with the adopted strategy for genetic risk scores by Cleynen et al., 11 we computed CD versus UC probability scores using logistic regression models. More specifically, we employed combined Smoothly Clipped Absolute Deviation (SCAD) and L2 (Ridge) penalized logistic regression (PLR)¹⁹ using the nevreg package.20 The parameter alpha, which determines the relative contribution of SCAD and L2 penalty in the penalization term, was set to 0.1. The maximal number of proteins (variables) included in the model was set to 28. We used nested cross-validation for parameter optimization and to estimate predictive performance. The regularization parameter lambda was optimized through an inner 5-fold cross-validation. We used outer leave-oneout cross-validation, estimating the probability of a specific diagnosis for each left-out sample within the range of 0-1. Ten models were fitted and the average probability estimate was used for each left-out sample. The median CD versus UC predicted probability scores based on protein models (referred to as CD vs. UC probability scores) were calculated for each subgroup. Differences between mean probability scores were compared using 1-way analysis of variance followed by Tukey's Honestly Significant Difference test and their adjusted confidence intervals were calculated. Protein contributions in the models were visualized by displaying model coefficients as boxplots. Thereby, the absolute coefficients indicate importance in the model. While positive coefficients contribute to a score closer to 1 (CD), negative coefficients contribute to a score closer to 0 (UC). The coefficients were estimated by fitting the models with all data in 1000 repetitions. Due to the randomness of the inner cross-validation and the related choice of lambda, the coefficients differed between models. We also estimated the performance of these scores to classify the subgroups, using the area under the receiver-operating-characteristic curve (AUC). As an additional approach to investigate possible influences of subgroup-specific medications and robustness, a CD versus UC model was fitted without including data from the Swedish inception cohort (SIC IBD). This model was then applied to the treatment-naïve patients in the SIC IBD to control for potential treatment effects.

Furthermore, probability scores were estimated using a Random Forest (RF) model using the R-package ranger to explore potential method dependency.²¹ We also investigated the subtype-specific differences using partial least square analysis as described in the Supplementary Material.

We employed SCAD/Ridge-PLR, RF, least absolute shrinkage, and selection operator (Lasso)-PLR,²² and regularized support vector machines with a radial kernel²³ to examine the capacity of different types of classification models to discriminate IBD subgroups based on protein

signatures. Repeated outer 5-fold cross-validation was applied and the AUC was used to assess model performance. We implemented repeated random down-sampling within the cross-validation procedure to prevent differences due to unequal group sizes.

3. Results

3.1. Clinical markers and patient characteristics

In total, data from protein analyses were obtained from 1551 adult patients (\geq 18 years) with IBD (CD, n = 883; UC, n = 639 and IBD-U, n = 29) and 312 HC (Table 1). The age distribution across subgroups (CD, UC, IBD-U, and HC) exhibited no statistical difference (p = 0.08). However, there was a predominance of male patients in the UC group compared to the CD group (p < 0.01). Detailed information about available C-reactive protein (CRP) and fecal calprotectin (FCP) levels across subgroups of individuals is shown in Supplementary Tables 5 and 6. Among individuals with available CRP (n = 1285), the median CRP was numerically highest in ileocolonic CD (7.3 mg/L), followed by ileal CD (4.7 mg/L), colonic CD (4.1 mg/L), and UC (2.7 mg/L), and lowest in the HC group (0.77 mg/L). Similarly, median FCP levels (n = 517) were highest in colonic CD (716.0 µg/g), followed by UC (579.0 µg/g), ileocolonic CD (487.5 μg/g), ileal CD (298.0 μg/g), and lowest in the HC (10.3 μ g/g).

3.2. Overall protein profiles by diagnosis

With unsupervised multivariable analyses, PCA score plots were generated to detect potential subgroups of patients with IBD whose inflammatory protein profile differed from other patients (Supplementary Figure 1). We could not identify any subgroup-related clusters of individuals among patients with IBD (n = 1551). Healthy controls (n = 312) largely overlapped with the patients with IBD, but PC1 scores differed between HC and IBD (p < 0.0001). No clear pattern related to the overall inflammatory serum proteome was observed between different locations of CD in the unsupervised PCA. However, the spatial separation between patients with ulcerative proctitis (E1) and HC was less pronounced compared to the delineation between patients with extensive colitis (E3) and HC, with left-sided colitis (E2) intermediate between E1 and E3, based on Kruskal-Wallis test and Dunn's post hoc test (Supplementary Figure 2). A loading plot showing the top 20 proteins with the highest loadings is displayed in Supplementary Figure 3. Similar results were obtained using UMAP (Supplementary Figure 4).

3.3. Individual protein levels by diagnosis and phenotypes

We next tested for differences in individual relative protein levels between UC (n = 639), ileal CD (n = 275), colonic CD (n = 188), ileocolonic CD (n = 420). and HC (n = 312). Twenty-nine inflammatory-related proteins had significantly

Table 1. Demographics and clinical characteristics of patients with inflammatory bowel disease and healthy controls.

		Crohn's disease, N = 883	Ulcerative colitis, N = 639	IBD-unclassified, N = 29	Healthy controls, $N = 312$
Sex, n (%)	Male	416 (47.1)	357 (55.9)	19 (65.5)	158 (50.6)
Median (IQR) Age, years		37 (26–51)	38 (28–53)	33 (28–47)	40 (27–55)
Smoking, n (%)	Never Current Previous Missing	365 (41.3) 161 (18.2) 147 (16.6) 210 (23.8)	275 (43.0) 50 (7.8) 130 (20.3) 184 (28.8)	12 (41.4) 1 (3.4) 11 (37.9) 5 (17.2)	34 (10.9) 3 (1.0) 8 (2.6) 267 (85.6)
Median (IQR) disease duration, years		7 (0–20)	4 (0–13)	0 (0–0)	
CD location, n (%)	Ileal (L1) Colonic (L2) Ileocolonic (L3) Upper GI (L4)	275 (31.1) 188 (21.1) 420 (47.6) 29 (3.3)			
CD behavior, n (%)	Non-stricturing, non- penetrating (B1) Stricturing (B2) Penetrating (B3) Perianal disease, n (%) *	371 (42.0) 273 (30.9) 239 (27.1) 184 (20.8)			
UC extent, <i>n</i> (%)	Proctitis (E1) Left-sided colitis (E2) Extensive colitis (E3)		105 (16.4) 220 (34.4) 314 (49.1)		
Previous IBD surgery, n (%) **	Yes	263 (29.8)	33 (5.2)	0 (0.0)	

Abbreviations: CD, Crohn's disease; GI, gastrointestinal tract; IBD, inflammatory bowel disease; IBD-U, IBD-unclassified; IQR, interquartile range; UC, ulcerative colitis.

Missing information for 10 patients with CD.

^{**}Missing information for 126 patients with CD, 115 patients with UC, 4 patients with IBD-unclassified.

higher levels in UC and all CD phenotypes compared to HC, while only fibroblast growth factor (FGF)-19 levels were significantly lower (Figure 1, Supplementary Table 7). FGF-19 remained significantly lower in all CD phenotypes and UC compared to HC, even after adjusting for age, sex, disease duration, and exclusion of patients with previous IBD-related surgery (Supplementary Figures 5 and 6).

In addition, C-X-C motif chemokine (CXCL) 10, C-C motif chemokine (CCL) 11, IL-10, and IL-17A displayed significantly higher relative levels (FDR < 0.05, absolute FC > 1.2) in patients with colonic inflammation (UC, colonic CD, and ileocolonic CD) compared to HC (Figure 1, Supplementary Table 7). No significant differences in these proteins with fold-changes >1.2 were observed in patients with isolated ileal CD compared to HC.

Comparisons of individual protein levels revealed a consistent pattern of variation according to disease location in patients with IBD (Figure 2, Supplementary Table 7). Matrix metalloproteinase (MMP)-10, IL-17A, FGF-19, IL-10, and CXCL9 were increased in patients with exclusive colonic inflammation, that is, UC and colonic CD, compared to patients with exclusive ileal inflammation, that is, ileal CD. In addition, levels of FGF-19 and IL-10 were increased in UC and colonic CD compared to ileocolonic CD. Boxplots visualize relative protein levels of the 6 proteins with the lowest *p*-values in the ileal CD versus UC comparison in CD subgroups, UC, IBD-U, and HC (Supplementary Figure 7). Detailed results of these comparisons, including *p*-value, FDR value, and log2 fold-change for each protein, are provided in Supplementary Table 7.

3.4. Identifying phenotypes across the IBD spectrum based on protein signatures

As an initial approach, we employed a protein model distinguishing CD from UC using PLR and RF and performed leave-one-out cross-validation. The CD versus UC logistic regression models yield a probability estimate for each left-out sample, ranging from 0 (indicating a higher predicted probability of a UC diagnosis) to 1 (suggesting a higher predicted probability of a CD diagnosis), thereby classifying patients along the observed CD-UC continuum. To further characterize the spectrum, we examined the CD versus UC estimates across the different CD phenotypes. We, therefore, estimated the median CD versus UC probability scores for each group: UC, IBD-U, colonic CD, ileocolonic CD, and ileal CD (Figure 3A). We observed a spectrum of IBD subgroups, with UC and ileal CD demonstrating the most distinct separation based on the CD versus UC probability score (Supplementary Figure 9). Probability scores significantly differed between colonic CD and UC (p < 0.001), ileal CD compared to colonic CD (p < 0.001), but not between ileal CD and ileocolonic CD (p = 0.07). The most important proteins selected in the CD versus UC model and shaping our observed spectrum included IL-17A, MMP-10, FGF-19, IL-10, signaling lymphocytic activation molecule (SLAMF1), CXCL10, and C-C motif chemokine (CCL)-4 as visualized in boxplots showing the coefficients of the model (Figure 3B). We used the AUC-ROC to explore the performance of the CD versus UC models and achieved an overall AUC of 0.75. While restricting the samples to UC and ileal CD yielded an AUC of 0.81, restricting the samples to UC and colonic samples only yielded an AUC of 0.65. Interestingly, based on the AUC, the UC versus CD scores were slightly, but not significantly (p = 0.07) better in segregating colonic IBD from ileal

IBD (AUC: 0.78) compared with UC from CD (AUC: 0.75). Based on medical review, experienced physicians reassessed the phenotype of patients with contradictive CD versus UC probability scores to explore the potential clinical impact of using these scores. The rephenotyping of 12 patients with colonic disease (colonic CD and UC, n = 6 each) and relatively high estimates, as well as of 6 patients with ileal CD and low estimates, raised doubts about the initial diagnosis in 28% (5 of 18) of these cases. We investigated the correlation between log2-transformed CRP values and FCP with the obtained probability scores to control for the influence of systemic and luminal inflammation. A significant positive correlation was observed for log2CRP, while a negative correlation was found for log2FCP. However, neither correlation was considered clinically relevant, as both were weak (*R*-squared < 0.04) (Supplementary Figure 9). To account for the potential influence of previous and ongoing IBD treatment, we repeated the analyses by excluding SIC IBD samples during model fitting and estimated probability scores of the left-out samples from only treatment-naïve patients. This approach yielded a pattern similar to the pattern observed in the leave-one-out cross-validation approach on the entire dataset (Supplementary Figure 10). Additionally, results from RF and partial least squares analyses demonstrated a pattern consistent with the probability scores obtained using PLR (Supplementary Figures 11A–C and 12A–C).

3.5. Evaluating diagnostic potential of inflammatory proteins based on classification models

Finally, we searched for IBD subgroups based on protein signatures. As a performance metric, we used the AUC since it encapsulates both specificity and sensitivity. Irrespective of the method adopted (least absolute shrinkage and selection operator [Lasso] or SCAD penalized logistic regression, support vector machine, or RF), the models exhibited limited abilities in discriminating between UC and colonic CD, with median AUCs < 0.62 (Figure 4). In contrast, the models separating UC from ileal CD demonstrated a higher performance, with median AUCs > 0.73, and the models differentiating colonic CD from ileal CD showed modest discriminative capacity (median AUCs between 0.67 and 0.69). Median AUCs of CD versus UC models were between 0.67 and 0.74, while median AUCs were between 0.74 and 0.78 of ileal CD versus colonic IBD models (Supplementary Figure 13). These different capabilities of the protein classification models to differentiate between subtypes demonstrate that the location of inflammation appears to exert a more pronounced effect at a systemic level, that is, on serum proteins, compared to the diagnosis alone, and highlights the distinction between ilealdominant CD and pure colonic CD.

4. Discussion

In this comprehensive cross-sectional study of >1800 individuals from multiple European cohorts, we delineated the inflammatory serum protein landscape in IBD across various subtypes. Our results demonstrated a lack of clear segregation in the overall protein profile of CD and UC, as the 2 main subtypes shared several proteins with significantly altered levels compared to controls. Instead, a continuum of IBD phenotypes from ileal CD over colonic CD to UC was identified. Differences in serum protein expression seemed

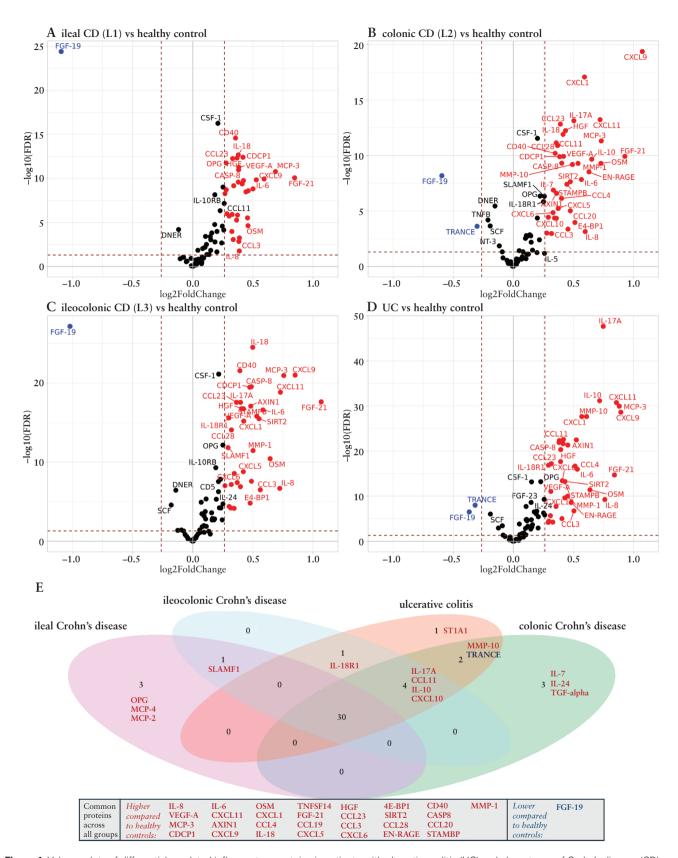


Figure 1. Volcano plots of differential regulated inflammatory proteins in patients with ulcerative colitis (UC) and phenotypes of Crohn's disease (CD) (*N* = 1551) compared to healthy controls (HC) (*N* = 312). Differentially regulated proteins are annotated and were selected based on fold-change >1.2 (equal to ~0.26 on a log2 scale) and significance (false discovery rate [FDR] < 0.05). Proteins with higher relative levels in CD subgroups or UC compared to HC are to the right, proteins with lower relative levels in CD or UC compared to HC are to the left. (A) ileal CD versus HC; (B) colonic CD versus HC; (C) ileocolonic CD versus HC; and (D) UC versus HC. (E) The Venn diagram visualizes proteins with higher estimates and lower estimates in patients with UC and with and ileal-, ileocolonic-, and colonic CD compared to HC. 4E-BP1, Eukaryotic translation initiation factor 4E binding protein 1; CASP-8, caspase-8; CCL, C-C motif chemokine; CD40, Tumor necrosis factor receptor superfamily member 5; CD8A, cluster of differentiation

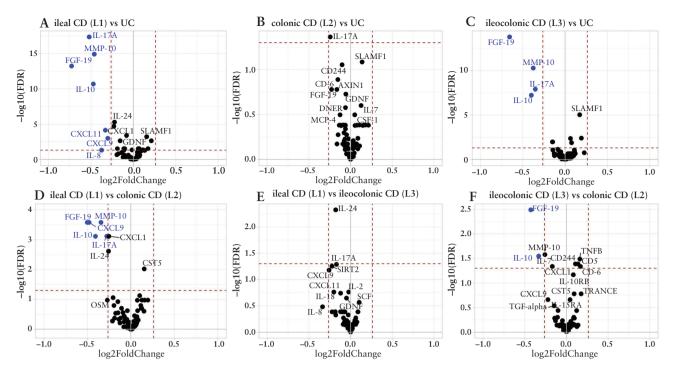


Figure 2. Volcano plots of inflammatory proteins from patients of groupwise comparisons based on fold-change >1.2 (equal to ~0.26 on a log2 scale) and false discovery rate (FDR) < 0.05. (A) ileal Crohn's disease (CD) versus ulcerative colitis (UC); (B) colonic CD versus UC; (C) ileocolonic CD versus UC; (D) ileal CD versus colonic CD; (E) ileal CD versus ileocolonic CD; (F) ileocolonic CD versus colonic CD. CXCL9, C-X-C motif chemokine ligand 9; CXCL11, C-X-C motif chemokine ligand 11; FGF-19, fibroblast growth factor 19; IL, interleukin; MMP-10, matrix metalloproteinase-10.

more pronounced between colonic and ileal CD than between colonic CD and UC.

Some previous omics-based studies have suggested that colonic CD represents an intermediate subtype between UC and ileal CD. Based on polygenic risk scores, Cleynen et al. 11 showed that ileal CD, colonic CD, and UC are entities along a genetic continuum in a large multinational IBD cohort. In alignment with this, transcriptomic profiling of circulating CD4 T-cells has demonstrated marked molecular differences across the IBD spectrum. 10 In a recent multiomics study of 163 patients with IBD, differences in the patterns of ileal and colonic inflammation were described based on analyses of the fecal metabolome, metaproteome, and microbiota composition. 12 Our work complements these findings by examining serum protein profiles as an additional informative layer for defining the intricate landscape of IBD and identifying colonic CD as an intermediate between ileal CD and UC.

Our analysis disclosed significantly different levels of specific proteins between subgroups of IBD, among which IL-17A, MMP-10, IL-10, and FGF-19 represented the top proteins when comparing colonic-dominant subtypes IBD (colonic CD or UC) to ileal CD. Also, CXCL11, SLAMF1, and CSF-1 were important for the CD versus UC probability scores in the multivariable PLR model, indicating their role in shaping the IBD spectrum.

Some of the proteins identified in our study have been highlighted in previous research related to IBD phenotypes, primarily in comparisons between CD and UC. Bourgonje et al.24 analyzed data from the 1000IBD study, which included 567 patients with CD and 461 with UC, using the same Olink panel. They reported significantly lower relative levels of MMP-10, IL-10, and FGF-19 in quiescent CD compared to quiescent UC. Furthermore, they found differences in FGF-21, IFN-gamma, TNFRSF9, CXCL10, CXCL9, and OPG between CD and UC.24 Our study also detected significant differences in FGF-19, MMP-10, IL-10, and CXCL9 when comparing ileal CD and UC, as well as between ileal CD and colonic CD. While we did not observe significant differences in CXCL10 and OPG levels between ileal CD and UC, higher CXCL10 levels were found in all subtypes compared to HC, except for ileal CD. Additionally, we observed higher OPG levels in patients with ileal disease compared to HC. In agreement with our findings, Bourgonje et al. also reported lower levels of FGF-19 in ileal compared to colonic CD. Kalla et al. also compared serum protein levels between CD and UC patients, and among reported significant differences, IL-17A and MMP-10 overlapped with our findings.²⁵ Notably, some of the individuals (n = 86) included in the study by Kalla et al.25 were also part of our dataset. Additionally, a study of 355 healthy first-degree relatives of CD patients found that especially CXCL9 is elevated in first-degree relatives who later in life were diagnosed with CD compared to those who were not diagnosed with the disease during follow-up. The authors also reported elevated CXCL9 levels in first-degree

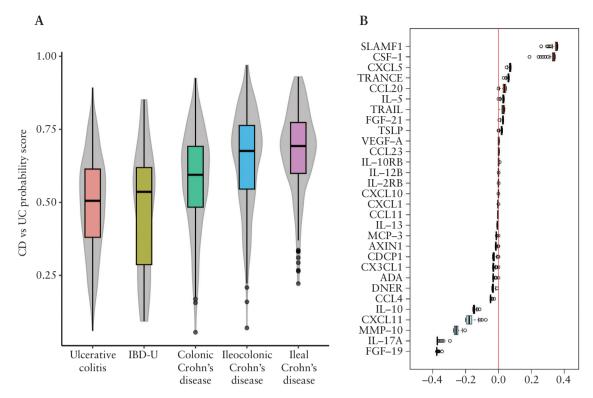


Figure 3. (A) Predicted Crohn's disease (CD) versus ulcerative colitis (UC) probability estimates from the penalized logistic regression model for UC, IBD unclassified (IBD-U), and phenotypes of CD. A value closer to 0 indicates a higher predicted probability of UC diagnosis, and a value closer to 1 a higher predicted probability of CD diagnosis. (B) Boxplots show coefficients of the UC versus CD models, indicating the importance of the respective proteins in the model. CCL, C-C motif chemokine; CDCP1, CUB domain-containing protein 1; CX3CL1, C-X3-C motif chemokine ligand 1; CXCL, C-X-C motif chemokine; DNER, Delta/Notch Like EGF Repeat Containing; FGF, fibroblast growth factor; IL, interleukin; IL-10RB, IL-10 receptor subunit beta; MCP-3, monocyte-chemotactic protein 3; MMP-10, matrix metalloproteinase 10; SLAMF1, Signaling lymphocytic activation molecule 1; CSF-1, colony stimulating factor 1; TNF, tumor necrosis factor; TRAIL, NF-related apoptosis inducing ligand; TRANCE, TNF-related activation-induced cytokine; TSLP, thymic stromal lymphopoietin; VEGF-A, vascular endothelial growth factor A.

relatives later in life diagnosed with CD with increased intestinal permeability based on the lactulose-mannitol ratio.²⁶ In our study, CXCL9 levels were significantly higher in UC and colonic CD compared to ileal CD, although levels were elevated in all subtypes compared to HC.

Beyond protein analyses, other molecular data have linked IL-17A, a key component of the Th17-inflammatory pathway, to IBD phenotypes.²⁷⁻²⁹ Consistent with our findings of higher IL-17A levels in IBD subgroups with colonic inflammation, Bogaert et al. observed pronounced upregulation of IL-17A gene expression in inflamed colonic biopsies, particularly in patients with UC.³⁰ Single-cell experiments based on inflamed colonic biopsies have also indicated greater involvement of IL-17 pathways in UC compared to CD.³¹ A previous Phase II/III trial in moderate to severe CD failed to demonstrate a difference between secukinumab, an anti-IL-17A monoclonal antibody, and placebo, but stratified analyses by disease location were not reported.³² Therefore, at present, the therapeutic implications of colonic upregulation are contradictory.

We also observed significantly elevated MMP-10 in patients with only colonic inflammation. Metalloproteinases fulfill important functions in extracellular matrix remodeling and wound healing,³³ yet they are also implicated in tissue breakdown and inflammation. Data from *MMP10* knockout mouse models,³⁴ along with previously reported upregulation of MMP-10 in serum during the preclinical phase of UC, suggest that MMP-10 may predominantly exhibit protective properties with preservation of mucosal homeostasis.³⁵ Our

current findings extend this observation by demonstrating that MMP-10 is also relevant in colonic CD. In contrast, the contribution of MMP-10 to the pathophysiology of ileal inflammation appears to be less significant.

Consistent with previous studies, downregulation of FGF-19 was seen in ileal CD. ^{18,24} FGF-19 is expressed in different cell types along the gastrointestinal tract, such as proximal enterocytes. ³⁶ The prominence of FGF-19 in the signatures that discriminated ileal-dominant CD from colonic subtypes points to low FGF-19 level as a marker of ileal inflammation and suggests impaired reabsorption of bile acids in patients with ileal CD. ³⁷ Previous studies indicate that the microbiome in ileal CD may be shaped by bile acid malabsorption, whereas neutrophil activity seems more pronounced in colonic disease. ¹²

The observed significant influence of disease location on the inflammatory serum proteome may have implications for designing therapeutic randomized trials, clinical practice, and future translational research in IBD. Given the unique composition and physiological characteristics of the ileal and colonic mucosa, it is plausible that the etiological pathways and their associated inflammatory profiles in the blood may differ, as earlier suggested. 9,10,12 This heterogeneity may subsequently affect the efficacy of a targeted therapy, which could be contingent upon the specific molecular pathways implicated in inflammation. Consequently, the therapeutic efficacy in ileal-dominant versus colonic-dominant disease may vary due to different underlying mechanisms. Interestingly, the efficacy of

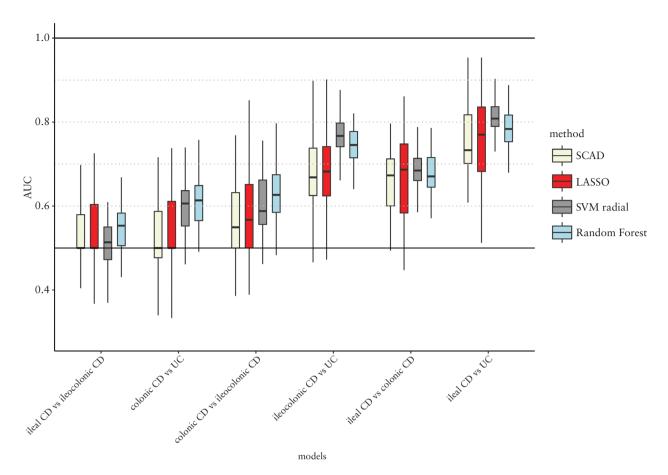


Figure 4. Comparison of the performance of the different models delineating down-sampled subgroups of inflammatory bowel disease (IBD) (each N = 188). Performance was evaluated in a repeated 5-fold cross-validation. Area under the receiver-operating characteristic curves (AUCs) of the Random Forest (RF), least absolute shrinkage and selection operator (Lasso)-penalized logistic regression, smoothly clipped absolute deviations (SCAD) combined with ridge-penalized logistic regression, and regularized support vector machine with a radial kernel (SVM radial). SVMs were fitted by selected most important proteins for the model based on variable importance in the inner cross-validation. CD, Crohn's disease; UC, ulcerative colitis.

different targeted therapies, such as adalimumab, infliximab, and vedolizumab, in CD has been reported to differ depending on the location of inflammation, with lower rates of endoscopic healing in ileal disease.^{38–40} In the VISIBLE 2 trial, the effect of vedolizumab was superior to placebo in patients with colonic and ileocolonic CD, but not in those with ileal disease.41 Moreover, a lower therapeutic efficacy in ileal CD was also reported in a recent meta-analysis of ustekinumab, vedolizumab, and anti-TNF trials.⁴² On the contrary, exclusive enteral nutrition has been reported to be more effective in ileal and ileocolonic CD compared with exclusive colonic CD43 and future anti-fibrotic drugs may be more relevant in the ileal-dominant subtypes.⁴⁴ As elucidated in our study, the differential protein expression across disease locations strengthens the notion that CD should be divided into an ileal-predominant and a colonic-predominant disease.6

There is currently very little information on molecular signatures defining IBD subphenotypes. Our study provides an initial glimpse into the set of circulating proteins that are differentially expressed between ileal CD and UC. While our analysis included a large number of patients across multiple cohorts, it was confined to a panel of 86 inflammatory serum proteins. Even though we only observed a weak correlation between the probability scores and CRP, it is possible that proteins not included in our analyses could be more discriminative of CD and UC-specific inflammation

or could highlight other subgroups of patients as suggested by Weiser et al.⁴⁵ We combined data from multiple cohorts collected and generated between 1997 and 2021. While adjustments for batch effects were made, these adjustments may have introduced or masked signals in the data, particularly due to unbalanced group sizes within the batches, which is a limitation of our study. However, the similarity in CD versus UC scores observed when analyzing only treatment-naïve patients, compared to the entire dataset, supports the validity of our results and suggests that our findings are robust and are not dependent on IBD treatments. By combining data from multiple cohorts analyzed in different runs, we aimed to identify general patterns related to IBD subtypes ensuring the generalizability and robustness of these results. Furthermore, our findings represent systemic rather than mucosal signatures, and future research should extend to tissue-based analyses to get additional insights. The absence of genetic data is a significant limitation of our study. Including additional layers of omics data could provide deeper insights into disease pathogenesis and enable conclusions about genetic influences.46 Eight of the proteins that differed between IBD subtypes and HC in our study have previously been associated with IBD susceptibility based on genomic data (CCL11, CCL20, CD40, CXCL1, CXCL5, IL-10, MCP-4, TRANCE), of which 4 proteins were common for all IBD subtypes versus HC in our analysis (CCL20, CD40, CXCL1, CXCL5).47 This

overlap and previously reported protein quantitative trait loci (pQTLs) analyses of proteins, such as CXCL5 and CXCL1, suggest a genetic basis for driving changes in levels of some of the identified proteins.^{24,47} Future research should further explore the genetic influence on protein levels within the IBD spectrum.

In summary, our results highlight the importance of redefining the classification of CD into ileal-predominant and colonic-predominant disease. In alignment with previous literature, the findings presented here support the concept of a need for distinct ileal versus colonic-specific therapies in IBD. Stratification of patients according to inflamed segments (ie, UC, colonic CD, and ileal CD) could also offer new insights into IBD pathophysiology.

Conflict of Interest

JH served as a speaker and/or advisory board member for AbbVie, BMS, Celgene, Celltrion, Dr. Falk Pharma and the Falk Foundation, Ferring, Galapagos, Gilead, Hospira, Index Pharma, Janssen, MEDA, Medivir, MSD, Novartis, Pfizer, Prometheus Laboratories Inc., Sandoz, Shire, Takeda, Thermo Fisher Scientific, Tillotts Pharma, Vifor Pharma, and UCB, and received grant support from Janssen, MSD, and Takeda. SV reports research support from AbbVie, Johnson & Johnson, Pfizer, and Takeda; lecture fees from AbbVie, Centocor, Ferring, Genentech/Roche, Hospira, Johnson & Johnson, Merck Sharp & Dohme, Pfizer, Takeda, and Tillotts, and consulting fees from AbbVie, Abivax, Celgene, Celltrion, Centocor, Ferring, Galapagos, Genentech/Roche, Gilead, GlaxoSmithKline, Hospira, Johnson & Johnson, Merck Sharp & Dohme, Mundipharma, Pfizer, ProDigest, Prometheus, Second Genome, Takeda, and Tillotts. BV has received research support for research from Pfizer, speaker's fees from Abbvie, Biogen, Bristol Myers Squibb, Chiesi, Falk, Ferring, Galapagos, Janssen, MSD, Pfizer, R-Biopharm, Takeda, Truvion and Viatris and consultancy fees from Abbvie, Alimentiv, Applied Strategic, Atheneum, Bristol Myers Squibb, Galapagos, Guidepont, Ipsos, Janssen, Progenity, Sandoz, Sosei Heptares, Takeda, Tillots Pharma, and Viatris. DB served as a speaker and/or advisory board member for BMS, Janssen, Pfizer, Pharmacosmos, Sandoz, Takeda, and Tillotts Pharma. CRHH has served as a speaker and/or advisory board member for AstraZeneca, Dr Falk Pharma and the Falk Foundation, Galapagos, Janssen, Pfizer, Takeda, Tillotts Pharma, and received grant support from Tillotts and Takeda. MC has received speaker's fees from ViforPharma. She is the national PI for clinical trials for AstraZeneca. None of these activities have any relation to the present study. LÖ has received financial support for research by Genetic Analysis AS, Biocodex, Danone Research, and AstraZeneca, and served as Consultant/Advisory Board member for Genetic Analysis AS, and as a speaker for Biocodex, Ferring Pharmaceuticals, Takeda, AbbVie, Novartis, Janssen-Cilag, and Meda. SA (included in the BIO IBD consortium) served as a member of Scientific committee/Advisory board of Pharmacosmos, Janssen, Takeda, as a consultant for Takeda, Janssen, and as a speaker: Galapagos, Janssen, Tillotts, received research grants from OrionPharma and Janssen. AC (included in the BIO IBD consortium) served as a speaker for Takeda and Tillotts Pharma. RU (included in the COLLIBRI consortium) served as a member of the Advisory Board and/or consulting for AbbVie, Bristol Myers Squibb, Celltrion, Janssen, Lilly, Pfizer, Roivant, and Takeda, and funded by a K23 Career Development Award K23 KD111995-01A1. KA (included in the COLLIBRI consortium) served as a speaker and/or advisory board member for BMS, Janssen, Pfizer, Falk, Lilly, Galapagos, and Takeda Pharma. The other authors report no disclosures relevant to the manuscript.

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Author Contributions

JH, SV, and BV contributed to study design and study planning, data collection, planning of the analyses, drafting,

and reviewing of the manuscript. BS contributed to data preprocessing, planning and conduction of the clinical and protein data analyses, drafting, and reviewing of the manuscript. PS contributed to the data preprocessing, functional interpretation of the results, drafting, and reviewing of the manuscript. DR contributed to the planning and supported the conduction of the data preprocessing and analyses, as well as critical revisions of the manuscript. DB, EA, OG, MC, CRHH, JDS, LÖ, CML, and RK contributed to data collection and reviewing of the manuscript. The COLLIBRI consortium contributed to the organization of data sharing between different centers, and reviewing of the manuscript. The BIO IBD consortium contributed to data collection and sharing and reviewing of the manuscript. All authors approved the final version of the manuscript.

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Data Availability

The data underlying this article cannot be shared publicly due to the privacy of the included patients and healthy control participants. The data will be shared on reasonable request to the corresponding author.

Supplementary Data

Supplementary data are available online at ECCO-JCC online.

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