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Activated HLA-DR+CD38+ Effector Th1/17 Cells Distinguish Crohn's Disease-associated Perianal Fistulas from Cryptoglandular Fistulas

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Background: Perianal fistulas are a debilitating complication of Crohn's disease (CD). Due to unknown reasons, CD-associated fistulas are in general more difficult to treat than cryptoglandular fistulas (non-CD-associated). Understanding the immune cell landscape is a first step towards the development of more effective therapies for CD-associated fstulas. In this work, we characterized the composition and spatial localization of disease-associated immune cells in both types of perianal fistulas by high-dimensional analyses.

Methods: We applied single-cell mass cytometry (scMC), spectral fow cytometry (SFC), and imaging mass cytometry (IMC) to profle the immune compartment in CD-associated perianal fistulas and cryptoglandular fistulas. An exploratory cohort (CD fistula, n = 10; non-CD fistula, n = 5) was analyzed by scMC to unravel disease-associated immune cell types. SFC was performed on a second fstula cohort (CD, *n* = 10; non-CD, *n* = 11) to comprehensively phenotype disease-associated T helper (Th) cells. IMC was used on a third cohort (CD, *n* = 5) to investigate the spatial distribution/interaction of relevant immune cell subsets.

Results: Our analyses revealed that activated HLA-DR+CD38+ effector CD4+ T cells with a Th1/17 phenotype were significantly enriched in CD-associated compared with cryptoglandular fstulas. These cells, displaying features of proliferation, regulation, and differentiation, were also present in blood, and colocalized with other CD4+T cells, CCR6+ B cells, and macrophages in the fistula tracts.

Conclusions: Overall, proliferating activated HLA-DR⁺CD38⁺ effector Th1/17 cells distinguish CD-associated from cryptoglandular perianal fistulas and are a promising biomarker in blood to discriminate between these 2 fistula types. Targeting HLA-DR and CD38-expressing CD4+ T cells may offer a potential new therapeutic strategy for CD-related fistulas.

Lay Summary

We applied high-dimensional analyses to profile the immune compartment in CD-associated and cryptoglandular perianal fistulas. Data analysis revealed activated HLA-DR+CD38+ effector Th1/17 cells as distinctly increased in CD-associated fstulas, suggesting a potential novel therapeutic target.

Key Words: high-dimensional analyses, perianal fistulas, Crohn's disease

Introduction

Crohn's disease (CD), one of the subtypes of infammatory bowel diseases (IBDs), is a chronic, immune-mediated disease. In patients with IBD, mucosal integrity of the intestine is often compromised, leading to translocation of luminal antigens and microbiota across the epithelial barrier.¹ Chronic inflammation is believed to arise from a dysregulated mucosal immune response to these microbial antigens.² Perianal fistulas, pathological connections between the intestinal lumen and the perianal skin, are a debilitating complication of CD. Up

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Key Messages

What is already known?

T helper CD4+ T cells are crucial drivers in the pathogenesis of Crohn's disease, but their role in perianal fistulas is understudied.

What is new here?

We, for the first time, performed high-dimensional singlecell and spatial interaction analyses of CD-associated and cryptoglandular perianal fistulas, revealing activated HLA-DR+CD38+ effector Th1/17 cells as distinctly increased in CD-associated compared with cryptoglandular fistulas, closely interacting with other (activated) effector CD4+ T cells and B cells, pointing to the potential function of this cell subset in the inflamed fistula tracts of CD patients.

How can this study help patient care?

Monitoring HLA-DR+CD38+ CD4+ T cells holds significant clinical promise for guiding treatment strategies due to the distinct treatment approaches for CD-associated and cryptoglandular perianal fistulas and the potential for fistulas to serve as initial disease manifestations.

to 26% of patients with CD suffer from perianal fstulizing disease within 20 years of initial diagnosis. $3-5$ $3-5$

More than 90% of all perianal fstulas are unrelated to IBD and may arise from infected anal glands and the onset of peri-anal abscesses and are hence called cryptoglandular.^{[6](#page-15-4)[-8](#page-15-5)} Crohn's disease–associated and cryptoglandular perianal fstulas look similar macroscopically but differ considerably in complexity, treatment strategies, and healing rates.^{[9](#page-15-6)} Distinction between these 2 types of fstulas is mainly based on the presence or absence of (previous) luminal infammation. However, in 30% of the patients with CD, development of a fstula is the frst manifestation and precedes luminal disease by years.¹⁰ In these cases, identifying CD-associated from cryptoglandular perianal fstulas might be challenging. In general, cryptoglandular fstulas are managed surgically, whereas CD-associated fstulas require combined surgical and medical approaches and still have a poor success rate.^{[11](#page-15-8),12} Most patients with CD-associated fstulas receive medical treatment with antitumor necrosis factor (TNF)- α , but their effectiveness is limited, with over 60% of patients that relapse after 1 year of maintenance therapy.[13](#page-15-10)[,14](#page-15-11) Thus, it is crucial to differentiate between the 2 types of fstulas in order to initiate the appropriate treatment trajectory, and concurrently, it is imperative to identify novel targets for therapy-refractory patients.

The pathogenesis of CD-associated fstulas is still elusive but likely involves host, microbial, and environmental factors. It has been speculated that luminal bacterial stimuli trigger an aberrant immune response that leads to persistent mucosal infammation in a genetically predisposed individual. Due to an aberrant immune response triggered by luminal bacterial antigens, cytokines, including TNF-α, transforming growth factor (TGF)-β, and interleukin (IL)-13, induce transcription factors that promote epithelial-mesenchymal transition (EMT) and cell invasion leading to fistula formation.¹⁵ An infammatory process also appears to play a crucial role in cryptoglandular fstulas next to the presence of EMT, but this is still understudied.^{16,[17](#page-15-14)}

The immune cell composition of the immune infltrates in both fstula types is still poorly characterized. Understanding the differences in the immune cell subsets present in the fstula tract between CD-associated and cryptoglandular fstulas could help us understand the underlying biological mechanisms contributing to fstula persistence.

High-dimensional single-cell mass cytometry (scMC) allows the simultaneous identifcation and characterization of immune cell populations across multiple lineages, providing the opportunity to explore the mucosal immune system at great depth.[18](#page-15-15) With this technique, we performed a comprehensive characterization of the immune cell landscape in perianal fstulas of CD-diagnosed patients and patients not diagnosed with CD. Peripheral blood mononuclear cell (PBMC) samples were also collected from these patients to explore if particular immune cell populations residing in the fstula were also present in blood. Additionally, a second cohort was obtained to investigate, by spectral flow cytometry (SFC), the proliferation, regulation, and differentiation state of HLA-DR+ CD38+ CD4⁺ effector memory T (T_{EM}) cells and CD8⁺ T_{EM} cells associated with CD fistulas. Lastly, a third cohort was used for the analysis of cellular distribution patterns by imaging mass cytometry (IMC). The data generated in this work were used to further dissect the infammatory process in fstulas and its drivers with the ultimate goal to provide insights for therapeutic approaches.

Materials and Methods

Overview of the Study

Firstly, we employed scMC to obtain a comprehensive immune cell landscape in perianal fstulas of patients with and without CD. In this cohort (cohort 1), we included 21 patients (CD, $n = 14$; non-CD, $n = 7$) undergoing surgical intervention at the Leiden University Medical Center (LUMC, Leiden, the Netherlands), the Proctos clinic (Bilthoven, the Netherlands), and the Alrijne hospital (Leiderdorp, the Netherlands), for their perianal fstula between July 2019 and June 2021. Curettage material of perianal fstulas, rectum biopsies, and peripheral blood mononuclear cell (PBMC) samples were collected and freshly processed. Some samples were excluded for further analysis due to a low number of total CD45⁺ cells $\left($ <1000; CD-fstula, *n* = 3; non-CD-fstula, *n* = 2; CD-rectum, *n* = 1; non-CD-rectum, $n = 2$), bad quality of the sample (CD-fistula, $n = 1$; CD-rectum, $n = 1$), or were not obtained because no patient consent for rectum sampling was given (non-CD-rectum, $n = 1$). Ultimately, we analyzed curettage material of 15 fistulas (CD, *n* = 10; non-CD = 5), 16 rectum biopsies (CD, *n* = 12; non-CD, *n* = 4), and 21 PBMC (CD, *n* = 14; non-CD, *n* = 7) samples. Secondly, based on our fndings in the scMC cohort, SFC was used to perform deep T cell phenotyping including the identifcation of the distinct T helper subsets. For this purpose, curettage material of perianal fstulas from a new cohort of CD patients ($n = 10, 3$ of whom were also included in cohort 1), and non-CD patients (*n* = 11) was collected during surgery at the LUMC, the Proctos Clinic and the Alrijne hospital from December 2021 to October 2022. After collection, material of this second cohort (cohort 2) was cryopreserved in freezing medium (20%FCS/60%RPMI/20%DMSO) for staining at a later time point.

Thirdly, we examined the interaction between immune cells using formalin-fxed paraffn-embedded (FFPE) samples

 $(n = 8)$ obtained from fistula tracts of a third cohort (cohort 3) of a total of 5 CD patients. We obtained 3 samples from one patient and 2 samples from another patient, as we had 3 and 2 tissue blocks, respectively, from the same fstula tract (same time point). For each sample, 2 consecutive slides were prepared and stained; one with Haematoxylin and Eosin (H&E) to determine immune cells around the tract and to select regions of interest (ROI) and another with a 40-marker antibody panel for IMC.

An overview of the study design and the patients' cohorts is displayed in [Figure 1](#page-3-0) and [Supplementary Table 1,](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data) respectively.

Human Samples

Patients eligible for inclusion were 18 years or older with an indication for incision and drainage of their perianal fstula, regardless of the type of perianal fstula (according to Parks' classification¹⁹) and number of fistulas or sidebranches. Patients with rectovaginal fistulas or with a fistula

after radiotherapy were excluded. The material was collected during surgery and further processed at the Department of Immunology of the LUMC. The medical data of the patients were retrieved from the electronic medical record. For the exploratory scMC cohort (cohort 1), fstula material was curetted via the external opening of the tract. The material within the tract was scraped via the external orifce of the fstula tract, which was dilated for this purpose. Two rectum biopsies were taken around the internal opening, and 16 mL of blood was drawn. For SFC (cohort 2), only fstula curettage material was used. Formalin-fxed paraffn-embedded samples (cohort 3) of fistula tracts were obtained from the pathology archive. The Medical Ethical Committee of the Leiden University Medical Center (LUMC) approved this entire study (protocol P18.069), and patients provided written informed consent. All specimens were anonymized and handled in accordance with the local ethical guidelines for the LUMC and in accordance with the Declaration of Helsinki.

Figure 1. Study design. Three different techniques were applied to samples from fistula-bearing patients with and without CD to unravel the immune cell landscape in perianal fistulas (single-cell mass cytometry; cohort 1; top row), the T (helper) phenotype of activated T cells associated with CD fistulas (spectral flow cytometry; cohort 2; middle row), and interaction of immune cells in situ (imaging mass cytometry; cohort 3; bottom row). Abbreviations: CD, Crohn's disease; PBMC, peripheral blood mononuclear cell; Dy, dysprosium; H&E, hematoxylin and eosin; IMC, imaging mass cytometry; AF, alexa fluor.

Experimental Methods

Sample Processing

In cohort 1, leukocytes were isolated from fresh rectal biopsies and fstula scrapings and stained with a 41-antibody panel [\(Supplementary Table 2](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data)) for scMC. For SFC (cohort 2), the cryopreserved isolated cells were stained with a 37-antibody panel ([Supplementary Table 3](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data)). A detailed description of the sample processing is provided in the [Supplementary Methods](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data).

In cohort 3, IMC was applied to FFPE fistula specimens. These samples were obtained during fstulectomy. Formalinfxed paraffn-embedded samples from fstula tracts were cut with a microtome (Leica RM225, Bannockburn, IL, USA) into 4-μm sections and were subsequently deparaffnized. The location of the fstula tract was determined together with the pathologist. Tissue sections were prepared for immunodetection by IMC and stained with a 33-antibody panel ([Supplementary Table 4](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data)) followed by laser ablation coupled to mass spectrometry to generate high-dimensional images as previously described.^{[20](#page-15-17)}

Antibodies, Antibody Staining, and Data Acquisition

Antibodies, manufacturers, and concentrations are listed in [Supplementary Tables 2](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data), [3,](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data) and [4](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data) for scMC, SFC, and IMC, respectively. For scMC and IMC, preconjugated metallabeled antibodies were either purchased from Fluidigm (San Francisco, California, USA) or conjugated in-house using 100 mg of carrier-free formulations of purifed antibody combined with the MaxPar X8 antibody labeling kit (Fluidigm Sciences) according to the manufacturer's instructions. Following conjugation, antibodies were diluted to 200 mL in Candor phosphate-buffered saline (PBS) antibody stabilization buffer (Candor BioscienceGmbH, Wangen im Allgäu, Germany) and stored at 4 °C. Self-conjugated antibodies were validated using OneComp beads (Invitrogen, Waltham, Massachusetts, USA) and on PBMCs. Further details on the antibody staining and data acquisition are described in the [Supplementary Methods.](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data)

Data Analysis

Single-cell CyTOF

First, for data cleaning, all samples were pregated, using the FlowJo v10 Software, on single, live CD45⁺ cells, removing duplicates, beads, dead cells, and debris. A reference PBMC sample was included in each experiment to account for technical variation. All reference PBMC samples were obtained from blood from the same healthy individual from whom cells were isolated and aliquoted. ComBat was applied to align the PBMC reference samples and corresponding patient samples to correct for batch effects.²¹ The markers CD66b, CD15, Nkp44, c-kit, CD40, CD80, and PD-L1 were not present in the reference PBMCs at sufficient levels to scale and were thus not normalized. For further analysis, these antibodies were not used for clustering but were shown for marker expression overlays and interpretation of data; CD45+ cells were sample-tagged, hyperbolic ArcSinh transformed with a cofactor of 5, and subjected to dimensionality reduction analysis in Cytosplore.²² Major immune lineages [\(Figure 2A\)](#page-5-0) were identifed at the overview level of a 5-level hierarchical stochastic neighbor embedding (HSNE) analysis on CD45+ data from fstula samples and rectal biopsy samples with default perplexity and iterations (30 and 1000, respectively).^{[23,](#page-15-20)[24](#page-15-21)} The CD4⁺ T cells, CD8⁺ T cells, innate lymphoid cells (ILCs), and B cells were analyzed separately in a data-driven manner up to a maximum number of 0.5×10^6 landmarks using *t*-distributed stochastic neighbor embedding $(tSNE).²⁴$ One rectum sample within the CD4⁺ T cell analysis had a 10-times higher number of cells than the other samples; for that reason, we downsampled to the second-highest cell count. The CD66b+ granulocytes and CD66b- myeloid cells were identifed within the myeloid cell compartment at the overview level of a 3-level HSNE analysis. Additionally, CD66b- myeloid cells were further analyzed using tSNE. Clustering of the data was performed by Gaussian mean shift (GMS) clustering in Cytosplore, and an algorithm was run that merged clusters showing high similarity in ArcSinh5-transformed median expression of all markers (-1) . Quantification of frequencies of clusters in each sample was performed in GraphPad Prism v9. The R-package "corrplot"²⁵ was used to calculate the correlation networks of cell frequencies of the identifed cell subsets.

Spectral fow cytometry

First, similar to what was described for scMC data, SFC data from all samples were cleaned, using the FlowJo v10 software, by gating on single, live CD45⁺ cells. A time gate was used to remove events acquired during unstable windows of acquisition. Conventional T cells were gated as $CD19$ $CD7$ ^{$+/-$} CD56 CD3+ TCR_{γδ} Va7.2 cells and subgated as $CD8_\alpha^+$ CD 8_β^+ (conventional $CDS_{\alpha\beta}$ ⁺ T cells) or CDS_{α} CDS_{β} FoxP3 Helios CD4+ (conventional CD4+ T cells). Subsets of conventional $CDS_{\alpha\beta}^*$ and $CD4^+$ T cells were gated based on CD45RA, CD45RO, and CCR7 expression. The full gating strategy is depicted in [Supplementary Figure 6A](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data)-[C](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data).

Imaging mass cytometry

An imaging processing pipeline was used to generate cell masks to convert raw IMC images into single-cell data.^{[26](#page-15-23)} This involved the creation of cell segmentation masks using semiautomated background identification with Ilastik²⁷ and CellProfiler,²⁸ after which the resulting masks were processed by ImaCyt[E29](#page-15-26) for the generation of FCS fles to obtain single-cell data. The t-SNE in Cytosplore was used to identify immune cell clusters. Cell clusters were merged based on overlapping markers and exported as separate FCS fles. The resulting subsets were imported back into ImaCytE for visualization of subsets in the segmentation masks, and localization was compared with original MCD images to validate the obtained clusters. In ImaCytE, an overview of phenotypes in the microenvironment was obtained. Next to that, ImaCytE allowed exploration of the spatial interaction of phenotypes and identifed which of the interactions were signifcant.

Statistical Analyses

Data were presented as individual points with the median and interquartile range (IQR). Group comparisons were performed using the Mann-Whitney *U* (MWU) test (2-tailed; Graphpad prism v9). The MWU test–generated *P* values of the 124 immune cell clusters identifed with the scMC analysis were subsequently adjusted for multiple hypothesis testing (FDR < 5%). To determine correlations between immune cell populations and to compare different tissues with each other, a Spearman's rank correlation analysis was applied.

Figure 2. Similar composition of the immune compartment in fistula tracts from patients with Crohn's disease and patients without Crohn's disease. A, HSNE embedding showing 2.3 × 10³ landmarks representing immune cells (2.9 × 10⁶) isolated from fistula scraping samples (*n* = 15), rectum biopsies (*n* = 16) from patients with Crohn's disease (*n* = 14) and patients without Crohn's disease (*n* = 7). Colors represent the different samples (left) and marker expression (right). B, Composition of the major immune lineages in fistula scraping samples ($n = 15$) and rectum biopsies ($n = 16$), represented in vertical bars. The size of the colored segments represents the proportion of the cells as a percentage of total CD45+ cells in the samples.

Results

Patient Characteristics

Baseline characteristics of all patients in cohort 1 and 2 are summarized in [Supplementary Tables 5](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data) and [6.](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data) In cohort 1, 85.7% of CD patients $(n = 14)$ were females and were the median age 41 years. Of the non-CD patients $(n = 7)$, 42.9% were females and were the median age 52 years. In cohort 2, 40% of CD patients $(n = 10)$ were females and were the median age 41.5 years, and of the non-CD patients $(n = 11)$, 27.3% were females and were the median age 44 years.

The median time since diagnosis of CD was 17.5 (cohort 1) and 12.0 (cohort 2) years, and the median time since diagnosis of the perianal fstula was 9.5 (cohort 1) and 6.0 (cohort 2) years. Biologics used for concomitant use included infiximab/ adalimumab (cohort 1, $n = 4$; cohort 2, $n = 5$), ustekinumab (cohort 1, $n = 4$; cohort 2, $n = 2$), vedolizumab (cohort 1,

 $n = 3$; cohort 2, $n = 0$), and both ustekinumab and vedolizumab (cohort 1, $n = 1$; cohort 2, $n = 0$).

Of the non-CD patients, no one used biologics. The median time since diagnosis of a fstula was 1.0 year in both cohorts 1 and 2. In 3 of 7 patients in cohort 1 and in 1 of 11 patients in cohort 2, a colonoscopy was performed to exclude CD diagnosis, while the remaining had no colonoscopy as they had a negative anamnesis focused on CD-typical symptoms, extraintestinal manifestations (EIMs) of CD, presence of immune-mediated diseases (IMIDs), and patients' family history according to our recently published flowchart.¹⁵ The feces calprotectin (FCP) value was not known.

No clinical information was accessible for the 5 patients in cohort 3. However, it was established that these patients had been diagnosed with CD and had undergone surgery for perianal disease.

Similar Presence of the Major Immune Cell Subsets in Fistula Tracts From Patients With and Without CD

The heterogeneity of the innate and adaptive immune system in perianal fstulas and rectum biopsies from 14 patients (exploratory cohort; cohort 1) with CD and 7 patients without CD was deciphered by measuring 41 immune cell markers by scMC. Hierarchical stochastic neighbor embedding in Cytosplore was applied to the entire data set encompassing 2.9 million CD45+ cells from the fstula tract (1.6 million cells) and rectum biopsies (1.3 million cells) to obtain a global overview of the major immune lineages. Based on lineage marker expression, we could distinguish CD4+ and CD8+ T cells, TCRγδ T cells, double-negative T (DNT) cells, B cells, innate-lymphoid cells (ILCs), granulocytes (CD66b+), and mononuclear phagocytes (CD66b, MNPs; [Figure 2A](#page-5-0)). Quantifcation of cell frequencies revealed that the CD4+ T cells and the myeloid cells were the most dominant cell types in the fstula tract ([Figure 2B](#page-5-0) and [Supplementary Figure 2](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data)), the latter to a large part composed of granulocytes. At this level of analysis, however, we did not observe signifcant differences between CD and non-CD patients in both fstula tracts and rectum biopsies with regard to the presence of the major immune lineages. Next, we individually analyzed the HSNE-defned major immune lineages at the single-cell level with t-SNE.

HLA-DR+CD38+ Effector CD4+ T and CD8+ T Cells Are Significantly Increased in CD-associated Fistulas Compared With Cryptoglandular Fistulas

We next used t-SNE to further explore the cellular heterogeneity within each major immune cell lineage. The embedding of the CD4+ T cell, CD8+ T cell, MNP, and ILC/NK cell compartment is shown in [Supplementary Figure 3A-D](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data). In total, this yielded 124 phenotypically distinct immune cell subsets in the fstula tract samples and rectum biopsies.

Hierarchical clustering of the CD4+ T cells yielded 18 phenotypically distinct immune cell clusters in the samples that are defned by a unique marker expression profle (Figure 3A). We could distinguish a naïve population (CD45RA+CCR7+ CD27⁺; cluster 6), antigen-experienced central memory (T_{CM}) populations (CD45RO+ CCR7+ ; clusters 2, 11-13, and 16), effector memory (T_{EM}) populations (CD45RO+CCR7; clusters 1, 3-6, 8-10, 14, 15, 17, and 18), and terminally differentiated effector memory (T_{EMRA}) populations (CD45RA+ CD45RO+/-CCR7- ; clusters 5 and 14). Differential expression of HLA-DR, CD38, CD25, PD-1, Tigit, CD161, CD127, CD27, and CD28 was present within the memory compartment. We next evaluated the samples quantitatively by analyzing the frequencies of the CD4+ T clusters for all fstula samples [\(Figure 3B](#page-7-0)). We did not quantitively assess the rectum samples due to the low sample size. This analysis indicated largely similar compositions of the immune compartment in the CD-associated and cryptoglandular fstulas, with the notable exception of an HLA-DR⁺CD38⁺ effector memory population ([Figures 3B](#page-7-0) and [C,](#page-7-0) cluster 10) that was signifcantly more abundant $(P = .0236)$ in CD-associated fistulas, constituting up to 20% of the CD4+ T cells compared with 5% of the CD4+ T cells in cryptoglandular fstulas. A signifcant proportion of these HLA-DR+CD38+ $\text{T}_{\text{\tiny{EM}}}$ cells expressed CD25, consistent with cellular activation. Moreover, heterogenous/variable expression of CD69, CD161, CD127, CD28, and PD-1 was observed ([Figure 3D](#page-7-0)).

Hierarchical clustering of the CD8+ T cells yielded 16 phenotypically distinct immune cell clusters in the fstula tract and rectum samples. These 16 immune cell clusters consisted of a naïve population (CD45RA⁺CCR7⁺CD27⁺; cluster 2), T_{CM} and T_{EM} populations (CD45RO+CD45RA; clusters 3-11, and 13-16), and T_{EMRA} populations (CD45RA+CCR7 CD45RO+/-; cluster 1 and 12; [Figure 3E\)](#page-7-0). Analysis of cluster frequencies showed one HLA-DR⁺CD38⁺ CD8 T_{EM} cell population (cluster 13) that was significantly ($P = .0372$) more abundant in CD-associated than in cryptoglandular fstulas ([Figure 3F](#page-7-0)). A related HLA-DR⁻CD38⁺ cluster (cluster 3) was not significantly different (*P* = .2771) but showed a trend towards a higher frequency in the CD-associated fstula compared with the cryptoglandular. Similar to the HLA-DR+CD38+ $CD4T_{EM}$ cell population, these CD8+ T cell subsets expressed CD25 and CD69, indicative of cellular activation.

Analysis of the ILC/NK and MNP compartment revealed a trend towards higher frequencies in certain ILC/NK cell and MNP subsets in CD-associated compared with cryptoglandular fstulas. Here, CD56brightCD16- CD11c+ NK-like cells (ILC compartment, cluster 11), dendritic cell types (MNP compartment, cluster 10; CD11c CD123+HLA-DR+ [pDC] and cluster 20; CD11c+ HLA-DR+ CCR7+), and a Lin-HLA-DR+ CCR7+ cell type (MNP compartment: cluster 8) showed an upward trend in CD-associated fstulas [\(Supplementary Figure 4A](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data) and [B](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data)). Moreover, an integrated correlation analysis revealed strong correlations between the activated CD4+ and CD8+ T cell subsets and these innate immune cell subsets (Supplementary [Figure 4C](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data)).

Together, these data demonstrate the presence of both CD4⁺ and CD8⁺ T_{EM} cell subsets, displaying an activated HLA-DR+ CD38+ phenotype that is signifcantly increased in CD-associated fstulas compared with cryptoglandular fstulas. The presence of these activated T cells is correlated with HLA-DR+ myeloid cell subsets and NK cells in CD-associated perianal fstulas.

Identification of Disease-associated CD4+ and CD8+ T Cell Phenotypes in Peripheral Blood of Patients With CD

We next sought to study whether the identifed CD-associated HLA-DR⁺CD38⁺ EM CD4⁺ (cluster 10) and (HLA-DR⁺) CD38+ EM CD8+ (clusters 13 and 3) T cell populations in perianal fstulas could be detected in peripheral blood.

Therefore, we analyzed the PBMC samples from non-CD $(n = 7)$ and CD $(n = 14)$ patients from the first cohort and manually gated on the populations of interest employing the gating strategy as depicted in Figure 4A. Strikingly, this revealed a signifcantly higher abundance of all 3 (HLA-DR+) CD38+ cell populations in PBMC from CD patients compared with non-CD patients [\(Figure 4B\)](#page-8-0). A t-SNE embedding of the HLA-DR+ CD38+ EM CD4+ T cell subset in the blood samples revealed a marker expression pattern similar to the equivalent subset in the tract, except for a higher expression of CD69 on the cells in the tract, consistent with tissue residency. Contrarily, CCR6 showed a higher expression on the HLA-DR⁺CD38⁺ EM CD4⁺ T cells in peripheral blood than in the fstula tract ([Supplementary Figure 5\)](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data). Similarly, marker expression overlays of the CD8+ T cell populations revealed overlap between the blood and tract counterparts, where the blood counterpart lacked the tissue-residency markers CD103 and CD69. The activation marker CD25 was also

Figure 3. HLA-DR+CD38+ effector CD4+T and CD8+T cells are significantly increased in Crohn's disease-associated perianal fistulas compared with cryptoglandular fistulas. A, Heatmap of CD4+T cell subsets identified through differential expression of the phenotypic markers indicated. The color indicates the median ArcSinh5-transformed marker expression values (blue-to-red scale) of the clusters identifed in [Supplementary Figure 3A](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data) (cluster partitions). B, Composition of the CD4+ T cell compartment in cryptoglandular fistulas (*n* = 5) and CD-associated fistulas (*n* = 10) represented in vertical bars where the size of the colored segments represents the proportion of cells as a percentage of total CD4⁺ in the sample. Colors for each cluster as in A. C, Frequencies of the one signifcant subset out of a total of 18 CD4+ T cell subsets among cryptoglandular fstulas (*n* = 5) and CD-associated fistulas ($n = 10$) as percentage of total CD4+T cells. Cluster numbers correspond to the ones in (A). Bars indicate median with interquartile range. Each

Figure 4. Identifcation of disease-associated CD4+ and CD8+ T cell phenotypes in peripheral blood of patients. A, Gating strategy used to identify HLA-DR+CD38+ CD4+ and CD8+T cells in blood. B, Frequencies of the HLA-DR+CD38+ CD4+ and CD8+T cells in blood among cryptoglandular fistulas ($n = 7$) and CD-associated fistulas ($n = 14$) as percentage of total CD4⁺T cells and CD8⁺T cells, respectively. Bars indicate median with interquartile range. Each dot represents an individual sample. Mann-Whitney *U* test with correction for multiple testing with a False Discovery Rate of 1% was performed. C, Correlation graphs of the HLA-DR+CD38+ CD4+ and CD8+ T cells in blood of the 14 CD patients.

dot represents an individual sample. Mann-Whitney *U* test with correction for multiple testing with a False Discovery Rate of 1% was performed. D, A t-SNE embedding showing the HLA-DR+CD38+ CD4+ T cells (61 000 cells) derived from rectum biopsies and fstula scrapings from CD patients and non-CD patients. E, Heatmap of CD8+ T cell subsets identifed through differential expression of the phenotypic markers indicated. The color indicates the median ArcSinh5-transformed marker expression values (blue-to-red scale) of the clusters identifed in [Supplementary Figure 3B](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data) (cluster partitions). F, Frequencies of the one significant subset (top) and the subset that showed a trend out of a total of 16 CD8+T cell subsets among cryptoglandular fistulas ($n = 5$) and CD-associated fistulas ($n = 10$) as percentage of total CD4⁺ T cells. Cluster numbers correspond to the ones in (E). Bars indicate median with interquartile range. Each dot represents an individual sample. Mann-Whitney *U* test with correction for multiple testing with a False Discovery Rate of 1% was performed.

more pronounced on both the HLA-DR+ CD38+ CD4+ T and CD8+ T cell subset in the fstula scrapings compared with their peripheral counterparts ([Supplementary Figure 5\)](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data).

Spearman's correlation analysis revealed a strong and signifcant correlation between the CD-associated HLA-DR+ CD38+ EM CD4+ T cell phenotype and both the HLA-DR CD38⁺ EM CD8⁺ T cell population ($r = 0.8$; $P = .0007$) and the HLA-DR+CD38+ EM CD8+ T cell population ($r = 0.8$; $P = .0005$) in the peripheral samples (Figure 4C).

Taken together, HLA-DR+ CD38+ EM CD4+ T cell and HLA-DR^{+/-}CD38⁺ EM CD8⁺ T cell populations were identified in blood, where they strongly correlated with each other. These populations discriminated fstula-bearing CD patients from cryptoglandular fstula-bearing patients.

Th17 CD4+T Cells Are More Activated in Fistulas From CD Patients and Show Skewing Towards a Th1 Phenotype

Using mass cytometry, HLA-DR+ CD38 + CD4+ T cells emerged as a distinguishing characteristic between CD-associated and cryptoglandular fstulas. We next aimed to determine the helper phenotype of these cells in fstula scrapings from CD and non-CD patients. For this purpose, we developed a 36-antibody SFC panel ([Supplementary Table 3](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data)) and applied it to single cells prepared from cryopreserved fstula tract scrapings from a new cohort (cohort 2) of CD patients $(n = 10)$ and patients without CD diagnosis $(n = 11)$. A conventional gating strategy was designed based on the phenotype of the activated cells detected in cohort 1 [\(Supplementary](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data) [Figure 6A-B](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data)). As observed in the mass cytometry analysis, we detected an HLA-DR+CD38+CD4+ T_{EM} subset in the CD patient samples ([Supplementary Figure 6D](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data)). Additionally, the increased sensitivity of this technique allowed for the detection of HLA-DR⁺CD38 and HLA-DR CD38⁺ CD4⁺ T_{EM} cells [\(Figure 5A\)](#page-10-0). Quantification of these subsets in the fistula scrapings revealed that both HLA-DR+CD38+ and HLA-DR+CD38 CD4+ T_{EM} were increased in frequency in CD-associated fistulas when expressed as percentage of $\rm T_{_{EM}}$ ([Figure 5B](#page-10-0), [C](#page-10-0)) and as percentage of total CD4+ T cells ([Figure](#page-10-0) [5E](#page-10-0), [F](#page-10-0)), while HLA-DR CD38⁺ CD4⁺ T_{EM} cells were not significantly different [\(Figure 5D,](#page-10-0) [G\)](#page-10-0).

In both fistula types, HLA-DR⁺CD38⁺ and HLA-DR $CD38$ ⁺ $CD4$ ⁺ T_{EM} subsets showed higher proportion of Ki-67+ cells, which was more pronounced in the former ([Supplementary Figure 7A,](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data) [B](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data)). These 2 subsets were also enriched for CD69⁺CD103 and CD39⁺ cells (Supplementary [Figure 7C](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data), [D\)](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data), and they displayed lower CD127 and higher CD25 expression when compared with the nonactivated HLA-DR-CD38- cells [\(Supplementary Figure 7E](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data), [F](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data)). These features were shared to a lesser extent with HLA-DR+CD38 \cdot CD4+ T_{EM} but did not reach statistical significance ([Supplementary Figure 7A-F](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data)). Regarding their Th phenotype, CD4+ T cells in the scrapings of both types of fstula tracts contained a variable proportion of $ROR_{\gamma}t^*$ CCR6^{lo/-} cells [\(Figure 5H](#page-10-0), [I\)](#page-10-0). The HLA-DR+ CD38+ and HLA-DR+ CD38 cells were significantly increased within the ROR_y^{t+} subset in CD-associated fistulas compared with the ROR_γt within the same fistulas and to the $ROR_{\gamma}t^*$ cells from the cryptoglandular fstulas [\(Figure 5J-L\)](#page-10-0). Moreover, T-bet expression was higher in HLA-DR⁺ ROR_γt⁺ CD4⁺ T_{EM} cells compared with their HLA-DR⁺ ROR_yt counterparts within CD-associated fstulas [\(Figure 5M,](#page-10-0) [N](#page-10-0)).

As observed for the CD4+ T cell compartment, we also detected a population of HLA-DR⁺ CD38⁺ within the CD8_{$\alpha\beta$}⁺ T_{EM} subset ([Supplementary Figure 6C,](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data) [F,](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data) [G\)](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data), as well as HLA-DR⁺CD38⁻ and HLA-DR CD38⁺ cells [\(Supplementary Figure](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data) [8A\)](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data). These populations were detected at higher levels than those found by mass cytometry ([Fig 3F](#page-7-0)), and no signifcant differences were observed between the 2 fistula types ([Supplementary Figure 8B-G](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data)). Of note, HLA-DR+ CD38+ $CDS_{αβ}$ ⁺ T_{EM} cells showed significantly higher expression of GrzB and Ki-67 than their HLA-DRCD38 counterparts ([Supplementary Figure 8H-K](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data)).

All in all, these data support the hypothesis that, in both types of fistulas, resident CD4⁺ T_{EM} undergo activation and show features of regulation and differentiation. However, in CD-associated fstulas, activation is mostly detected in CD4+ T_{EM} with a mixed Th1/17 phenotype, based on both T-bet and ROR^γ t expression.

Heterogeneous Immune Infltrates Around the Fistula Tract of Crohn's Disease Patients

Subsequently, we employed IMC to investigate the cellular neighborhood in which the activated CD4+ T cells are residing. For this purpose, we designed a dedicated 33-metaltagged antibody panel ([Supplementary Table 4\)](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data) and comprehensively characterized fistula tracts from five CD patients (cohort 3). Our selected antibody panel consisted of structural markers (vimentin, alpha-smooth muscle actin [α-SMA], and D2-40), and innate and adaptive immune cell markers ([Supplementary Table 4\)](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data). The IMC data could be quantifed similarly to scMC using tSNE by using a cell mask to segment all cells into single cells. Downstream cluster analysis of 32 ROIs in Cytosplore yielded a total of 236 808 cells, of which 152 750 cells were CD45+ immune cells. The nonimmune cells comprised mostly of α -SMA⁺ myofibroblasts, D2-40⁺ lymphatic vessels, and nonspecifed cells (DNA+) lacking CD45 or immune lineage-defning markers, most likely fbroblasts ([Supplementary Figure 9A](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data)). In Figure 6A, 5 representative ROIs from 5 patients are depicted. Immune cells (in green) were localized close to the tract, whereas nonimmune cells (in dark blue) were localized deeper within the tissue, or lining the tract (Figure 6A).

Within the immune cell compartment, we identifed granulocytes, different types of myeloid cells, B cells, T cells, and ILCs [\(Figure 6B](#page-12-0) and [Supplementary Figure 9B\)](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data). Within the T/ILC compartment, we distinguished 15 phenotypically distinct immune cell clusters consisting of CD4+ T cells, CD8+ T cells, double-negative T (CD4- CD8- , DNT) cells, TCRγδcells, and ILCs. All CD4+ and CD8+ T cells expressed CD45RO, and subclusters were formed based on differential expression of HLA-DR, CD57, CCR6, and Ki-67 ([Supplementary Figure 9C-E](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data)). Importantly, we identifed immune cell phenotypes representative of those that were signifcantly enriched in CD-associated fstulas in our single-cell data set, such as activated CD4⁺ and CD8⁺ T cells (HLA-DR⁺ and $Ki-67+HLA-DR^*$; [Supplementary Figure 9D](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data) and [E\)](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data). The HLA-DR+ CD4+ T cells showed a dispersed or clustered pattern around the tract (Figure 6C) and contained potentially proliferating cells (Ki-67+ , indicated in white).

As recently described by Hoch et al, we also observed a cluster with cells that simultaneously expressed CD20 and CD3, referred to here as BnT cells.³⁰ Myeloid cells (in light blue) were evenly distributed and were prominently present

Figure 5. Phenotype of HLA-DR/CD38 subsets from memory CD4+T cell subsets in fistula scrapings. Phenotypic characterization of CD4+T cell subsets in fistula scrapings from patients with cryptoglandular and CD-associated fistulas. (A) Representative plots depicting HLA-DR and CD38 expression in CD4+ T_{EM} cells from fistula scrapings from 2 patients with cryptoglandular (left panels) or CD-associated fistulas (right panels). B-D, Frequencies of (B) HLA-DR+CD38+, (C) HLA-DR+CD38[.] and (D) HLA-DR[.]CD38+ cells from CD4+ T_{EM} cells; (E-G) Frequencies of (E) HLA-DR+CD38+, (F) HLA-DR+CD38[.] and (G) HLA-DR[.]CD38+ cells from total CD4+T cells. H, Representative plots depicting CCR6 and RORγt expression in CD4+T_{EM} cells from fistula scrapings from a patient with cryptoglandular (left panel) or CD-associated fistula (right panel); (l) frequency of RORγt* cells from CD4*T_{EM} cells; (J) representative

in the immune infltrates around the tract. With the addition of CD68 and CD163 to this IMC antibody panel, we could identify macrophages. Granulocytes clustered together close to the border of the tract (patients 1, 3, and 4) or were evenly distributed throughout the infamed tissue (patients 2 and 5).

In summary, IMC allowed for the identifcation and localization of innate and adaptive immune cells, profling the immune cell landscape around the tract at great depth. Furthermore, the cell phenotypes observed with imaging mass cytometry closely resembled those found by single-cell mass cytometry. In particular, HLA-DR+ CD4+ T cells could be identifed around the fstula tract in a clustered or dispersed manner.

HLA-DR+CD4+T Cells Colocalize With Other CD4+T Cells, B Cells, CD8+T Cells, and Macrophages

Next, we leveraged spatial information to quantify cell-cell interactions between several immune cell types. This enabled us to systematically study the microenvironment of HLA-DR+ CD4+ T cells, including Ki-67+ and Ki-67- cells, at the single-cell level. The interactions were determined in the tissue within a 5-pixel (5-um) radius and corrected for differences in cell cluster frequencies using permutation testing, 29 ruling out that identifed interactions do occur at random. An interaction was strong with a z-value of >2.0 (ie, outside 95% normal distribution range) and, on the contrary, was mutually exclusive (ie, the level of interaction is lower than what would be expected based on random chance) with a z-value of <2.0 ([Supplementary Table 7](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data)).³¹ This allowed us to identify which cells might infuence, or are infuenced by, HLA-DR+ CD4+ T cells by direct contact and/or secreted products.

Eighteen subsets signifcantly interacted with HLA-DR⁺CD4⁺ T cells (Figure 7A, [Supplementary Table 7](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data)). Most HLA-DR+ CD4+ T cells resided in the neighborhood of HLA-DR+ CD45+ immune cells, possibly myeloid cells, and cells from the same phenotype. Interestingly, they also colocalized frequently with B cells, most frequently with CCR6+ B cells, but also, to a lesser extent, with proliferating (Ki-67+) B cells. Moreover, they were also in close vicinity of CD8+ T cells, including HLA-DR+ CD8+ T cells, ILCs, and CD14⁺CD68⁺CD163^{+/-} myeloid cells [\(Figure 7B\)](#page-13-0). It is noteworthy that HLA-DR+ CD4+ cells were mutually exclusive with granulocytes, other myeloid cells, and CD45- nonimmune cells comprising of vimentin⁺ cells, α -SMA⁺ myofibroblasts, D2-40⁺ lymphatic vessels, and DNA⁺ nonspecified cells lacking CD45 or immune lineage-defning markers [\(Supplementary](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data) [Table 7\)](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data), which indicates that they are located in different cellular environments.

Taken together, spatial cell-cell interaction analysis revealed a close interaction of HLA-DR+ CD4+ T cells with, HLA-DR+ CD45+ cells, (activated) CD4+ T cells, B cells, CD8+ T cells, ILCs, and macrophages. Remarkably, considerable proliferation was noted within this neighborhood, including the

HLA-DR+ CD4+ T cells, other CD4+ T cells, B cells, and CD8+ T cells.

Discussion

Here, for the frst time, high-dimensional techniques were applied to comprehensively characterize the innate and adaptive immune cell landscape of CD-associated perianal fistulas and cryptoglandular perianal fstulas at the single-cell level. Single-cell mass cytometry, spectral flow cytometry, and imaging mass cytometry combined allowed us to delineate the cellular diversity in both types of perianal fstulas in-depth. Our analyses revealed a disease-specifc signature of activated CD4+ T cells with a mixed Th1/17 phenotype and high proliferative capacities in perianal fstulas of patients with CD. We showed that this phenotype colocalized with other CD4⁺ T cells, CCR6+ B cells, and macrophages in situ.

Recently, we and others highlighted that HLA-DR+ CD38+ CD4+ T cells are associated with intestinal infammation in a subset of IBD patients.^{[32](#page-16-0)[,33](#page-16-1)} In the present study, we observed the enrichment of HLA-DR+ CD38+ CD4+ T cells in virtually all CD-associated fstulas; moreover, in a subset of these patients, this was accompanied by the presence of HLA-DR+ CD38+ CD8+ T cells. This may imply that this HLA-DR+ CD38+ T cell phenotype is associated with a more aggressive disease course in CD, resulting in penetrating disease. Activated HLA-DR+ CD4+ T cells have also been identifed in immune-mediated diseases affecting the synovial fuid in juvenile idiopathic arthritis (JIA) 34 and rheumatoid arthritis (RA) patients.^{[35](#page-16-3)} In JIA patients, activated effector T helper cells are resistant to Tregmediated suppression, suggesting an important pathogenic role for this activated phenotype. Studying Treg-mediated suppression of HLA-DR+ CD38+ CD4+ T cells in the context of IBD would thus be of interest in future studies.

Strikingly, activated HLA-DR⁺CD38⁺ CD4⁺ and CD8⁺ T cells could also be identifed in blood and discriminated a subset of fstula-bearing CD patients from cryptoglandular fstula-bearing patients. Of note, in some patients with complex perianal disease the development of fstulas can precede luminal infammation by several years and sometimes CD is never diagnosed, making it diffcult to rationally decide on an appropriate treatment. Therefore, in these patients, monitoring HLA-DR⁺CD38⁺ CD4⁺ and CD8⁺ T cells in blood may have clinical potential to predict CD diagnosis and guide treatment decisions. However, follow-up of the cohort exhibiting cryptoglandular fstulas is essential to corroborate the absence of luminal disease development in these patients. Spectral flow cytometric analysis of fistula samples confirmed the significant increase in HLA-DR+CD38 CD4+ T_{EM} cells in CD-associated compared with cryptoglandular fstulas. Moreover, this analysis demonstrated higher percentages of HLA-DR⁺ RORγt⁺ CD4⁺ T_{EM} cells in CD-associated fistulas and these $HLA-DR$ ⁺ $ROR\gamma t$ ⁺ cells also displayed higher levels

plots depicting HLA-DR and CD38 expression in RORγt (top panels) and RORγt* (bottom panels) CD4* T_{EM} cells from fistula scrapings from a patient with a cryptoglandular (left panel) or CD-associated fistula (right panel); (K,L) Frequencies of (K) HLA-DR+CD38+and (L) HLA-DR+CD38[.] in ROR_Yt and RORγt* CD4* T_{EM} cells; (M) histograms showing Tbet expression on HLA-DR* RORγt[.] (white) and HLA-DR*RORγt* (gray) CD4* T_{EM} cells from fistula scrapings from a patient with a cryptoglandular (left panel) or CD-associated fistula (right panel); (N) expression levels of T-bet, shown as geoMFI, on HLA-DR+RORγt (open dots) and HLA-DR+RORγt+ (black dots) CD4+ T_{EM} cells from fistula scrapings from patients with cryptoglandular or CD-associated fstulas. In (K), (L), and (N), values from populations from the same patient are paired and joined by a line. In (B-D) and (E-G), exact *P* values from a Mann-Whitney test are shown. In (K), (L), and (N), exact p values from a paired 2-way ANOVA with multiple comparisons are shown. Cryptoglandular fistula scrapings ($n = 11$, except for panel [N] where samples with <100 HLA-DR+ RORgt^{+/-} cells were excluded from the analysis, $n = 6$), CD-associated fistula scrapings $(n = 10)$.

 \mathbf{A}

 $#1$

 $#2$

 $#3$

#4

#5

Figure 6. Heterogeneous immune infiltrates around the fistula tract of Crohn's disease patients. Visualization of the structure (A) and the spatial distribution of the major immune lineages (B) and activated CD4+T cells (C) in one single representative region of interest (ROI) of 5 different patients by imaging mass cytometry. Each color represents a cell type as indicated in the legend. Abbreviations: α-SMA, α-smooth muscle actin; CD, cluster of differentiation; ILC, innate lymphoid cell.

CD45⁺Lin

of T-bet, suggesting that activation occurs preferentially in cells with a mixed Th1/17 phenotype. Additionally, Th1/17 cells have been described in the context of actively infamed gut tissue in patients with CD, where they produce both IL-17A and interferon (IFN)- γ .^{[36](#page-16-4)[,37](#page-16-5)} This further strengthens our hypothesis that activated CD4⁺ T_{EM} cells could help to

DNT/DPT γδ T cells ILCs

distinguish CD-associated from cryptoglandular fstulas. The cytokine IL-23 contributes to the polarization of naïve CD4+ T cells into IL-17-producing Th17 cells, while IL-12 in turn induces the transformation of the highly plastic Th17 cells into IFN-γ-producing Th1/17 cells.³⁸ The distinctive presence of activated Th1/17 cells in CD-associated fstulas suggests that

B

HLA-DR+CD4+ T cells interacting with

Figure 7. Homotypic and heterotypic cellular interactions of activated CD4+T cells in CD-associated fistula tracts. A, The percentages of HLA-DR+CD4+ T cells interacting with an immune cell phenotype displayed on the *y*-axis. The immune cell phenotypes that are signifcantly interacting (Z-score >2.0) with HLA-DR+CD4+ T cells are shown. B, Visualization of the interaction of HLA-DR+CD4+ T cells with other CD4+ T cells (top row), B cells (middle row), and CD14+CD68+CD163+/- cells (bottom row). The cell colors match those in panel A.

the monoclonal antibody ustekinumab, directly targeting the common p40 subunit of IL-12 and IL-23, could be effective in patients with perianal CD (pCD). In a systematic review, Brewer et al showed perianal improvement after induction with ustekinumab in 110 (31.6%) of 348 patients. Fistula remission was observed in 69 (24.7%) of 279 patients. In the same article, the authors performed a meta-analysis and data from CERTIFI and UNITI trials were included in the post hoc pooled analysis. These randomized controlled data (*n* = 150

patients treated with ustekinumab; *n* = 71 patients treated with placebo) showed at 8-week follow-up a fistula response in 26.0% of patients treated with ustekinumab compared with 16.9% fistula response in placebo patients $(P = .14)$. The rate of complete fstula resolution at 8 weeks was 24.7% in ustekinumab-treated patients compared with 14.1% in placebo patients $(P = .073).^{39}$ Prospective randomized trials are needed to further elucidate long-term efficacy of ustekinumab and other biologicals for pCD. In the case that effector

memory Th1/17 cells do actively produce IFN**-**γ in the fstula tract of CD patients, it remains to be shown whether blocking IL-12/IL-23 can prevent this from happening. Due to the chronic nature of infammation in the tracts, simultaneously targeting other infammatory cells, such as fbroblasts and macrophages, together with activated T cells, might help break the cycle of tissue damage.

In the primary mass cytometry data set, we observed that frequencies of both HLA-DR+ CD38+ CD4+ T and HLA-DR+ CD38+ CD8+ T cells were signifcantly increased in CD-associated perianal fstulas compared with cryptoglandular fstulas. In a second cohort of patients, spectral fow cytometry was employed, revealing a clear and signifcant increase in the frequency of HLA-DR+ CD38+ CD4+ T cells, distinctly differentiating CD-associated fstulas from cryptoglandular fstulas, and thus confrming the mass cytometry data. However, no signifcant difference was observed in HLA-DR+ CD38+ CD8+ T cells between the 2 patients groups. Nevertheless, although HLA-DR+ CD38+ CD8+ T cells do not distinguish CD-associated from cryptoglandular fstulas, they are present in both types of fstulas and may play a role in the pathogenesis and persistence of fstulas. We observed [\(Supplementary Figure 8\)](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data) that this phenotype expresses granzyme B in both CD-associated and cryptoglandular fstulas, suggesting a likely cytotoxic function. It would be of interest to study the functional role of these cells in perianal fstulas in future studies.

To our knowledge, we are the frst to investigate the spatial localization of innate and adaptive immune cells in CD-associated fstulas in great depth. Imaging mass cytometry with over 40 immune cell markers simultaneously and coupled to a cell segmentation analysis pipeline²⁶ allowed for visualization of complex phenotypes, including the HLA-DR+ CD4+ $T_{\text{\tiny{EM}}}$ cells. Interestingly, HLA-DR+ CD4+ $T_{\text{\tiny{EM}}}$ cells colocalized mainly with cells displaying the same phenotype, other CD4+ T cells, and CCR6+ B cells. The interaction with B cells has been described in both IBD and other immune-mediated diseases. In seropositive synovial samples from patients with RA, activated PD-1+CXCR5+ and PD1+CXCR5 CD4+ T cells, also expressing HLA-DR and CD38, were found adjacent to B cells[.40](#page-16-8) Moreover in CD, Martin et al observed the production of CXCL13, a B cell attractant, in a subset of T cells that expressed HLA-DR and CD38 mRNA in samples from inflamed ileum.³³ Collectively, these results suggest that activated CD4+ T cells could provide B cell help. Furthermore, in one of the fstula tracts, IMC analysis revealed the presence of an organized cluster of cells with a B cell-rich center surrounded by a T cell-rich zone and myeloid cells in the outer layer ([Figure 6B](#page-12-0) #1). This cluster might be an ectopic lymphoid-like structure (ELS), which is linked to deleterious outcomes in certain autoimmune conditions[.41](#page-16-9) In RA, for example, it is associated with inadequate response to anti-TNF.[42](#page-16-10) Concurrently, in infamed CD lesions, activated CD4+ T cells are part of a module that mediates nonresponsiveness to anti-TNF.^{[33](#page-16-1)}

Finally, we observed the presence of macrophages in close proximity to the activated HLA-DR+ CD4+ T cells. Martin et al described chemokine-receptor pairs including CXCL9 and CXCL10 in dendritic cells and macrophages, whose receptor was highly expressed on activated T cells, among others.³³ Our data show the activated HLA-DR⁺ CD4⁺ T cells also express CXCR3 [\(Supplementary Figure 7I\)](http://academic.oup.com/ibdjournal/article-lookup/doi/10.1093/ibd/izae103#supplementary-data), suggesting a role

for CXCL9/CXCL10 and CXCR3 interaction for attracting macrophages and activated T cells in perianal fistulas in CD patients. Additionally, our observations indicate that proliferating Ki-67+ CD4+ T cells, CD8+ T cells, and B cells colocalize with macrophages and HLA-DR+ CD45+ Lin- cells. These fndings suggest that these cell types are all involved in the local activation, expansion, and spatial organization of adaptive immune responses.

In this study, we provide novel insights into the immune cell landscape present in both CD-associated and cryptoglandular fstulas. These fndings provide a rationale for future functional studies, which are essential to enhance the understanding of the roles played by these cells and, thereby, to develop potential therapeutic targets. Subsequent studies should prioritize investigating this. The small sample size in this study is a clear limitation. The substantial heterogeneity within the cohort and the small sample size preclude our ability to examine, among other things, the infuence of various therapies on immune cell populations and the correlation between the frequency of these activated Th cells with therapy refractoriness and the necessity for a stoma. Hence, in a subsequent study, it would be necessary to collect a larger longitudinal cohort to determine whether these activated Th cells are linked to fstula development in patients with CD.

For the included patients in the cryptoglandular fistula group, a FCP test and endoscopy were not routinely performed during sample collection to rule out CD. However, it is noteworthy that all included patients with a cryptoglandular fstula exhibited a favorable disease course without abnormalities or EIM. In the future, we would recommend both FCP assessment and endoscopy when dealing with cases of recurrent fstulas where CD has not yet been diagnosed.[15](#page-15-12)

Crohn's disease–associated and cryptoglandular perianal fstulas differ substantially in treatment and prognosis. It is therefore essential to fnd clues to differentiate between them and to develop new targeted therapies for CD patients with treatment-refractory fstulas. In this work, we revealed HLA-DR⁺CD38⁺ CD4⁺ T cells to be exclusively associated with infammation in CD fstula tracts. The same phenotype was increased in peripheral blood of fstula-bearing CD patients compared with fstula-bearing patients without CD. These HLA-DR⁺CD38⁺CD4⁺ T cells are in close vicinity to B cells and potentially provide B cell help. Targeting HLA-DR and CD38-expressing CD4+ T cells may offer a potential new therapeutic strategy for CD-related fstulas.

Supplementary Data

Supplementary data is available at *Infammatory Bowel Diseases* online.

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Author Contribution

All authors contributed to the study. L.O., M.B., F.K., A.M., and M.F.P. contributed to experimental design and conceptualization of the study. L.O., C.F., Q.J., and M.S. performed experiments. L.O., T.A., S.L., and M.F.P. analyzed and interpreted the data. W.H., I.H.G., K.P., and F.H. provided study samples. L.O. wrote the frst draft of the manuscript. C.L., Q.J., M.S., T.A., S.L., M.B., W.H., I.H.G., K.P., F.H., F.K., A.M., M.F.P. critically revised the manuscript. A.E. and M.F.P. are shared last authors. All authors have read and agreed to the published version of the manuscript.

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Conficts of Interest

The authors have declared that no confict of interest exists.

Data Availability

The data will be made publicly available upon paper acceptance.

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