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*CORRESPONDENCE Dina R. Weilhammer Weilhammer1@llnl.gov

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Single-cell and spatiotemporal transcriptomic profiling of brain immune infiltration following Venezuelan equine encephalitis virus infection

Margarita V. Rangel, Aimy Sebastian, Nicole F. Leon, Ashlee M. Phillips, Bria M. Gorman, Nicholas R. Hum and Dina R. Weilhammer*

Biosciences and Biotechnology Division, Lawrence Livermore National Laboratory, Livermore, CA, United States

Neurotropic alphaviruses such as Venezuelan equine encephalitis virus (VEEV) are critical human pathogens that continually expand to naïve populations and for which there are no licensed vaccines or therapeutics. VEEV is highly infectious via the aerosol route and is a recognized weaponizable biothreat that causes neurological disease in humans. The neuropathology of VEEV has been attributed to an inflammatory immune response in the brain yet the underlying mechanisms and specific immune cell populations involved are not fully elucidated. This study uses single-cell RNA sequencing to produce a comprehensive transcriptional profile of immune cells isolated from the brain over a time course of infection in a mouse model of VEEV. Analyses reveal differentially activated subpopulations of microglia, including a distinct type I interferon-expressing subpopulation. This is followed by the sequential infiltration of myeloid cells and cytotoxic lymphocytes, also comprising subpopulations with unique transcriptional signatures. We identify a subpopulation of myeloid cells that form a distinct localization pattern in the hippocampal region whereas lymphocytes are widely distributed, indicating differential modes of recruitment, including that to specific regions of the brain. Altogether, this study provides a high-resolution analysis of the immune response to VEEV in the brain and highlights potential avenues of investigation for therapeutics that target neuroinflammation in the brain.

KEYWORDS

single cell RNA sequencing, Venezuelan equine encephalitis virus (VEEV), neuroimmunology, encephalitis, spatial trancriptomics

Introduction

Venezuelan equine encephalitis virus (VEEV) is a mosquitoborne virus within the Alphavirus genus and Togaviridae family that has caused devastating outbreaks of disease among humans and equine in the Americas over recent decades (1-3). VEEV is maintained in a sylvatic cycle between mosquitos and wild rodents but can spill over and amplify to high titers in equine, leading to epizootic and epidemic outbreaks. VEEV is a New World alphavirus, which are mostly encephalitic, as opposed to the Old World alphaviruses, which cause mostly arthritogenic disease. The virus causes an acute febrile illness that can lead to severe and lethal encephalitic cases with neurological symptoms spanning dizziness, headache, confusion, seizures, and stroke. While the mortality rate overall is <1% in adults and <5% in children, central nervous system (CNS) infections and neurological manifestations can occur in up to 14% of cases and among encephalitic cases, risk of mortality increases up to 10% in adults and 35% in children (2, 4). In addition to the natural transmission route via mosquito bite, humans are also susceptible to infection via aerosol exposure, as demonstrated by the report of multiple lab-acquired infections (5, 6). This, paired with the fact that VEEV can be grown to high titers, contributes to its designation as a category B priority pathogen by the National Institutes of Health and as a select agent by the Centers for Disease Control and Prevention. There are no specific treatments available for VEEV infection nor virus-induced encephalitis. A challenge in treating such infections is an incomplete understanding of the key drivers of pathogenesis, specifically the cellular and molecular changes underlying the progression of damaging inflammation that occurs in the brain. Thus, a temporal and spatial characterization of VEEV pathogenesis in the brain would elucidate the mechanisms of disease and the role of the host immune response, as well as aid the identification of potential therapeutic targets.

Previous studies have established that inflammation is a key component of VEEV neuropathogenesis. Severe vascular cuffing, cellular infiltration, edema, and neuronal karyorrhexis can be observed histologically in VEEV-infected brains (7-9). An elevation of pro-inflammatory cytokines (e.g. IL-1β, IL-6, IL-12, TNF, and IFN- γ) and components of antigen presentation, apoptosis, and antiviral response (e.g. Cxcl9, Cxcl10, Cxcl11, Ccl2, Ccl5, Irf7, Ifi27, Oas1b, Fcerg1, Mif, Clusterin, and MHC class II), have been detected in VEEV-infected mouse brains via histological, cytokine array, and RNA microarray techniques applied to brain homogenate or total RNA (10-13). The host immune response plays paradoxical roles during VEEV infection in that a sufficiently robust response is required for systemic clearance, meanwhile cell depletion experiments and experiments in immune-compromised mice demonstrate a dampened response can improve outcome (14, 15). These findings suggest that immune invasion in the brain is a large contributor to disease outcome. Thus, defining functions of discrete populations of immune cells that infiltrate the brain during infection would provide an opportunity to identify targetable pathways for immunomodulatory therapies.

There is currently an incomplete understanding of the specific activation states of resident and infiltrating immune cells and the roles they play during the inflammatory response to VEEV infections. Further, the kinetics of the response and sequential recruitment of these cells has not been thoroughly described. Here, we aimed to bridge this gap in knowledge by generating a high-resolution profiling of the transcriptional activity of individual immune cells in the brain over a time course of VEEV infection using an established murine model, paired with spatial transcriptomic analysis during severe neuropathology. We applied single-cell RNA sequencing (scRNAseq) to immune cells isolated from the brains of C3H/HeN mice infected with VEEV TC-83 at 2, 4, and 6 dpi. Fluctuations in the immune populations present in the brain were observed during these key timepoints of disease development. We identified sequentially emerging subpopulations of microglia and infiltrating myeloid and lymphoid cells with unique transcriptional profiles. Spatial transcriptomic analysis on brains at 6 dpi revealed differential distribution of immune cell subtypes, with a subtype of myeloid cells localizing at the periphery of the cortex and hippocampal region of infected brains whereas other myeloid and lymphoid groups were more widespread. These results comprise a comprehensive temporal profiling of transcriptomic activity in the brain in response to VEEV infection that provide insight into key immune players during the onset of neuroinflammation, information crucial to a fundamental understanding of VEEV pathogenesis and the potential design of host-based immunomodulatory therapeutics. Additionally, spatial characterization of key populations during a highly diseased state highlights specific regions of the brain exhibiting differential immune activity that may be important to consider for effective delivery of brain-targeting treatments.

Materials and methods

Cells and virus

Vero E6 cells were obtained from the American Type Culture Collection (ATCC) and maintained in Dulbecco's modified Eagle's medium (DMEM, Thermo Fisher) supplemented with 10% fetal bovine serum (FBS, ATCC) supplemented with 100 units/mL penicillin and 100 μ g/mL streptomycin (Thermo Fisher) at 37°C in 5% CO₂. Venezuelan equine encephalitis virus (VEEV) strain TC-83 (NR-63) was obtained from the NIH Biodefense and Emerging Infections Research Resources Repository, NIAID, NIH. VEEV stocks were propagated in Vero E6 cells and harvested via clarification of cell culture supernatant by centrifugation. Titers of viral stocks were determined by standard plaque assay consisting of a methyl crystalline cellulose overlay and crystal violet staining (16).

Mouse infections

All animal work was approved by the Lawrence Livermore National Laboratory Institutional Animal Care and Use Committee under protocol #310. All animals were housed in an Association for Assessment and Accreditation of Laboratory Animal Care (AAALAC)-accredited facility. Animals are tested on a quarterly basis for pathogens chosen based on recommendations from the FELASA Working Group on Health Monitoring and guidelines provided from AALAS experts. C3H/HeN mice (strain ID 025) were obtained from Charles River. 5–10-week-old female mice were used in all experiments. Groups of mice were inoculated intranasally with $2x10^7$ PFU TC-83 while under anesthesia (4-5% isoflurane in 100% oxygen). Mice were monitored daily for signs of morbidity and animals were humanely euthanized upon signs of severe disease by CO₂ asphyxiation. For tissue harvest, animals were anesthetized under isoflurane and the whole animal was perfused with 20 mL sterile PBS containing 50,000 U/L sodium heparin *via* the left ventricle.

Brain tissue isolation and preparation

Brains for flow cytometric, scRNAseq, cytokine, and viral titer analysis were isolated from infected mice on days 2, 4, or 6 postinfection. Preparation of brain tissue was performed as previously described (17). Following euthanasia and perfusion, brains were removed and placed in 1 mL digestion buffer (PBS pH 7.4 (Thermo Fisher) + collagenase (Worthington) + DNase I (Roche) to a final concentration of 3 mg/mL and 0.5 mg/mL, respectively) on ice in a 1.5 mL tube. Brains were finely diced into 1-2 mm³ pieces with scissors and tissue was digested at 37°C for 30 min in a total of 5 mL digestion buffer. A cell suspension was generated by gentle pipetting followed by passage through a 70 µm cell strainer. The cell strainer was rinsed with PBS supplemented with 5% FBS to a total volume of 20 mL. Aliquots of this suspension were stored at -80°C for cytokine and viral titer analysis. The remaining suspension was subjected to Percoll gradient centrifugation to purify mononuclear immune cells for flow cytometric analysis or RNA sequencing as previously described (17). For flow cytometry experiments, cells were stained and analyzed from individual brains. For RNA sequencing, brains from 3 animals were pooled and sequenced as a single sample for each condition.

Isolation of splenocytes

Spleens were harvested from uninfected mice and mice at 6days post-infection following cardiac perfusion with PBS supplemented with heparin, as described above, and placed in 1 mL of DMEM supplemented with 2% FBS. Tissue was mechanically disrupted with a plunger through a 40-micron filter over a 50 mL conical tube, followed by two washes of PBS supplemented with 2% FBS. Suspensions were pelleted by centrifugation and red blood cells were lysed using ACK Lysis buffer (Thermo Fisher). Cells were washed twice and processed for flow cytometry as described below.

Single-cell RNA sequencing of brain samples and data analysis

Single-cell suspensions of mononuclear immune cells from uninfected mouse brains and infected brains were prepared as described above. Cells were counted on a Countess II automated cell counter prior to single-cell sequencing preparation using Chromium Single-cell 3' GEM, Library & Gel Bead Kit v3 (10x Genomics Cat # 1000075) on a 10× Genomics Chromium Controller following manufacturers' protocol. Subsequently, libraries were sequenced on Illumina NextSeq 2000. The Cell Ranger Single-Cell Software Suite (version 6.1.2) (10x Genomics) was then used to perform sample demultiplexing, barcode processing, and single-cell gene counting. After demultiplexing the sequencing files with "cellranger mkfastq", "cellranger count" was used to perform alignment to mouse reference transcriptome (mm10), barcode processing and gene counting. Further analysis was performed using Seurat (18). First, cells with fewer than 500 detected genes per cell or mitochondrial content greater than 10% and genes that were expressed by fewer than 5 cells were filtered out. Potential doublets and CD45⁻ cells were also removed. After preprocessing, we performed data normalization using default parameters and identified 2000 most variable features. Then, anchors for data integration were identified using the 'FindIntegrationAnchors()' function using default parameters. Next, these anchors were passed to the 'IntegrateData()' function and a new integrated matrix with all four datasets was generated. After data integration, data was scaled using ScaleData() function with default parameters, and the dimensionality of the data was reduced by principal component analysis (PCA). Subsequently, cells were grouped into an optimal number of clusters for de novo cell type discovery using Seurat's 'FindNeighbors()' and 'FindClusters()' functions (dims = 1:30, resolution = 0.2). A non-linear dimensional reduction was then performed via uniform manifold approximation and projection (UMAP) and various cell clusters were identified and visualized. Genes differentially expressed between clusters were identified using 'FindMarkers()' function implemented in Seurat. Gene ontology (GO) enrichment analysis was performed using ToppGene Suite (19) and heatmaps were generated using custom R scripts. Single-cell pseudo-time trajectories of immune cell subpopulations were constructed with Monocle 2 (20) as described before (21).

Single-cell RNA sequencing of blood samples and data analysis

PBMCs were isolated from whole blood collected from uninfected mice and mice at 6-days post-infection via cardiac puncture. Blood was combined with 0.5 M EDTA for a final concentration of 5 mM then red blood cells were removed by incubation with ACK lysis buffer. PBMCs were then washed twice with PBS. Sequencing libraries were generated using Chromium Single-cell 3' GEM, Library & Gel Bead Kit v3 (10x Genomics Cat # 1000075) on a 10× Genomics Chromium Controller following manufacturers' protocol. Subsequently, libraries were sequenced on Illumina NextSeq 2000. Sequencing files were demultiplexed using "cellranger mkfastq". Subsequently, "cellranger count" was used to perform alignment to mouse reference transcriptome (mm10), barcode processing and gene counting. Further analysis was performed using Seurat (18) as described above.

Bulk RNAseq data analysis

We used publicly available data (22) to identify VEEV infection-induced changes in different regions of the brain. Raw counts were downloaded from Gene Expression Omnibus (GEO, accession ID: GSE213725). Data was then normalized using the Trimmed Mean of M-values (TMM) normalization method implemented in edgeR (version 3.42.2) (23). For differential expression analysis, the limma package (24) was employed in conjunction with the voom transformation (25). Heatmaps for genes of interest were generated using the pheatmap package (26), and a boxplot was created using the ggplot2 package (27), both in R (version 4.3.1) (28).

Flow cytometry

Cells were incubated for 30 min on ice in 100 µl Hank's balanced salt solution (Thermo Fisher) + 2% FBS with Fc block (1:100 dilution, clone 2.4G2; BD Biosciences), Zombie Yellow viability dye (1:500 dilution, BioLegend), and the following antibodies, each diluted 1:500: CD45 APC-Cv7 (clone 30-F11; BD Biosciences), CD11b PE-CF594 (clone M1/70; BD Biosciences), CD3 PerCP-Cy5.5 (clone 17A2; BD Biosciences), CD4 BV650 (clone GK1.5; BD Biosciences), CD8 FITC (53-6.7; BioLegend), CD49b PE (clone DX5; BD Biosciences), and Perforin PE/Dazzle 594 (clone S16009A; BioLegend). Cells were then fixed using BD Cytofix/Cytoperm (BD Biosciences) according to manufacturer's instructions. Flow cytometry was performed using a FACSAria Fusion and data were analyzed using FlowJo software (version 10.10.0). Microglia and infiltrating myeloid and lymphoid cells were identified as preciously described (17). Microglia were identified as CD45^{int} CD11b^{int}. To distinguish CD45^{hi} CD11b⁺ myeloid cells from NK cells that also express CD11b, we identified these cells as CD45^{hi} CD11b⁺ CD49b⁻. The remaining cells were labeled as lymphocytes. Ly6C expression was also confirmed in myeloid cells. Gating was further informed by fluorescence minus one (FMO) controls previously performed during panel optimization.

Cytokine analysis

Cytokines were quantified using LEGENDplexTM multiplex beadbased assay (BioLegend) using the mouse anti-virus response panel according to manufacturer's instructions. Flow cytometry of the beads was performed using a FACSAria Fusion and data were analyzed using BioLegend's cloud-based analysis software available at https://legendplex.qognit.com (version 2023-02-15).

Immunohistochemical staining of mouse brains

Brains for immunohistochemical staining were collected from infected mice at 6 dpi. Upon euthanasia and perfusion as described above, mice were perfused with 20 mL 10% neutral buffered formalin (NBF). Isolated brains were subsequently immersed in 10% NBF at 4°C for 3 days with gentle agitation. Following fixation, brains were paraffin-embedded and cut into 5 µm thick sections. All sections were dewaxed with xylene and hydrated with alcohol. Citrate or Tris-EDTA were used for antigen retrieval, and hydrogen peroxide (ab64218, Abcam) was used to block endogenous peroxidase. After blocking non-specific sites with CAS-block (008120, Thermo Fisher Scientific), sections were incubated with Ly6c primary antibody diluted 1:200 (ab314120, Abcam) and secondary antibody diluted 1:500 (ab6720, Abcam). 3,3'-diaminobenzidine (DAB) kit (ab64238, Abcam) was used for visualization, and hematoxylin was used to stain the nuclei. All sections were rinsed with distilled water and sealed with permount (sp15-100, Fisher Scientific).

Spatial transcriptomics

Spatial transcriptomic analysis of a VEEV-infected brain collected 6 days post-infection was conducted using 10x Visium technology (10x Genomics). 5 µm brain sections were mounted onto charged slides, deparaffinized, and stained with hematoxylin and eosin. The brain sections were imaged at 4x magnification using an ECHO Revolve microscope and the tiles were stitched together using Affinity Photo (version 2.3, Serif). The brain sections were then destained and decrosslinked to release RNA sequestered by formalin fixation. Next, the sections were incubated with mousespecific probes targeting the whole transcriptome (PN-1000365, 10x Genomics), allowing for the hybridization and ligation of each probe pair. Gene expression probes were released from the tissue and captured by spatially barcoded oligonucleotides on the Visium slide surface using the Visium CytAssist instrument. Gene expression libraries were then prepared from each tissue section and sequenced using the Illumina NextSeq 2000.

After sequencing, the data and histology images were processed with the Space Ranger software (10x Genomics) and Seurat (18). After demultiplexing the sequencing files with "spaceranger mkfastq", the fastq files and the brightfield image of the tissue were provided to "spaceranger count" and read alignment, tissue detection, fiducial detection, and barcode/UMI counting were performed. Seurat was used then used for filtering (nFeature_Spatial > 500 & nCount_Spatial > 500 & percent.mt < 30), data normalization, dimensionality reduction, clustering, identification of spatially variable genes, and visualization. For each sample, after filtering, the data was normalized using "SCTransform()" function implemented in Seurat, with default

parameters. Dimensionality reduction and clustering analysis was performed using "RunPCA()", "FindNeighbors()", "FindClusters ()" and "RunUMAP()" functions (dims = 1:30, resolution=0.25). We then applied the "FindAllMarkers()" function to identify genes enriched in each cluster. We also performed integrative analysis of uninfected and infected brain samples using the "SelectIntegrationFeatures(nfeatures = 5000)", "PrepSCTIntegration()", "FindIntegrationAnchors()", and "IntegrateData ()" functions, followed by dimensionality reduction using PCA and UMAP. Clusters were visualized in UMAP space using DimPlot() and overlaid on the tissue image using "SpatialDimPlot()" function.

Statistical analyses

Statistical significance was determined using Prism Version 10.2.3 (347) (GraphPad, La Jolla, CA). Experiments were performed at least twice and corresponding n, specific tests and p values are indicated in the figure legends. Assumptions of normality and variance were evaluated within Prism.

Results

Single-cell RNA sequencing reveals robust and sequential immune cell infiltration in mouse brains during VEEV infection

To understand the progression of the neuroinflammatory immune response to VEEV, we profiled the fluctuations of immune cell populations in the brain and their transcriptional activity using scRNAseq on immune cells isolated from mouse brains over a time course of VEEV infection. We first confirmed infection dynamics in an established mouse model of VEEV. C3H mice were infected intranasally with 2x107 PFU VEEV TC-83 and monitored for signs of disease over six days, encompassing both the early lymphoid phase and central nervous system phase of the typically biphasic disease observed in mice (29, 30). Signs of disease including ruffled fur and hunched posture were observed in some mice by 4 days post infection (dpi) and by 6 dpi all mice exhibited these symptoms in addition to ataxia, a sign of neurological disease (Figure 1A). Weights of infected mice began to decline by 5 dpi and were significantly different versus uninfected controls by 6 dpi (Figure 1B). At various timepoints post infection, additional groups of mice were euthanized to measure brain viral load. High infectious viral titers in the brain were detected by 2 dpi and peaked by 4 dpi (Figure 1C). Histological examination of infected brains was performed at 6 dpi. Hematoxylin and eosin-stained coronal sections of infected brains revealed increased cellularity, edema, and perivascular cuffing (Figures 1D, E). Our results closely recapitulated previously characterized disease progression and pathological characteristics in this model of VEEV infection (30).

C3H mice were then infected as described above and at 2, 4, and 6 dpi, brain cerebral hemispheres from infected mice and uninfected controls were harvested and processed to perform scRNAseq or spatial transcriptomic analyses (Figure 1F). For scRNAseq, single-cell suspensions from 3 mice were pooled and mononuclear immune cells were isolated using Percoll gradient centrifugation, as previously described (17). The following number of cells were profiled for each condition: Uninfected: 2,298, TC-83 2 dpi: 1,698, TC-83 4 dpi: 5,005, and TC-83 6 dpi: 6,488. Unsupervised clustering of the data resulted in 9 clusters that were each assigned to a putative cell-type identity based on their unique profile of differentially expressed genes (DEGs) encoding cell-type specific markers (Figures 2A, B). Brains at each timepoint post-infection exhibited unique immune compositions as compared to the uninfected control (Figure 2C). In uninfected brains, microglia were the predominant immune population detected, as expected. Microglia formed 3 subclusters over the course of infection that we termed resting microglia (MG), activated MG 1, and activated MG 2 (microglia 1, 2, and 3). Activated MG 1 and 2 are representative of a deviation from a homeostatic cell state upon infection. Resting MG compose 88% of total immune cells in uninfected mice and are the most enriched in microglia homeostatic markers Cx3cr1 and Tmem119, which are downregulated in activated MG 1 and activated MG 2 (Figure 2B; Supplementary Figure 1A). At 2 dpi, activated MG 1 and 2 increased in relative abundance (16% and 3%, respectively) and exhibit enrichment in additional genes indicative of an activated state, including Cd63, Cd72, and Mif (Figures 2B, D). Activated MG 1 continued to increase in relative abundance through 4 dpi, detected at a comparable level to resting MG, 16% and 17%, respectively, while activated MG 2 remained at approximately 3%. At 6 dpi, activated MG 1 decreased to 3% and activated MG 2 to less than 1%. Distinct antiviral response gene expression was observed across the microglia subclusters, with activated MG 1 exhibiting the highest expression of viral RNA sensors Ifih1, which encodes melanoma differentiation-associated protein 5 (MDA5) and Ddx58, which encodes retinoic acid-inducible gene I (RIG-I), as well as type I IFN gene Ifnb1 (Supplementary Figure 1A). Following the early shifts in microglial populations, we observed an immense infiltration of myeloid and lymphocyte populations that together comprise a larger proportion of sequenced cells at day 4 and 6 post infection than microglia (Figures 2C, D). We additionally confirmed this pattern of myeloid and lymphocyte infiltration using flow cytometry (Figures 2E, F).

Between uninfected and 2 dpi, the most notable shifts were those in the microglia subclusters, as described earlier, as well as detection of cluster 0, identified as myeloid cells, cluster 2, identified as NK cells, and cluster 6, identified as proliferating NK and T cells. Between 2 and 4 dpi, there was a large increase in myeloid cells (4% to 34%) and NK cells (4% to 16%) and a modest increase in cluster 5, identified as dendritic cells (DC) (3% to 7%). We also identified a small neutrophil cluster which accounted for less than 0.5% of cells at 4 and 6 dpi. T cells accounted for ~3% of the immune cells present in the brain at 4 dpi. Between 4 and 6 dpi, the myeloid and dendritic cell clusters remain relatively steady (40% and 7%, respectively) while there is an increase in NK cells (16% to 24%) and cluster 4, identified as T cells (3% to 18%) (Figures 2D, E). Notably, it is between day 4 and 6 during which neurological symptoms and severe brain pathology present and weight loss and survival begin to decline.



FIGURE 1

VEEV TC-83 Infection in C3H mice. 5-8-week-old C3H mice were infected intranasally with 2e7 PFU of VEEV TC-83 and symptoms (A) and weight loss (B) were monitored. Data are shown as mean ± standard error of mean (SEM) (n=4-12). Experiments were repeated at least twice. Two-tailed p values were calculated using 2-way Repeated Measures ANOVA with Bonferroni's correction for multiple comparisons. Brain viral titers were evaluated (C). Two-tailed p values were calculated using Kruskal-Wallis and Dunn's multiple comparisons test. Signs of pathology in the brain were observed by H&E histological staining (D, E); yellow arrows denote vascular cuffing. (F) Schematic representation of experimental workflow for scRNAseq and spatial transcriptomic analysis of VEEV-infected brains. Following VEEV infection as described above, the cerebral cortex of 3 uninfected mice or 3 infected mice harvested at 2, 4, and 6 dpi were processed to yield a single cell suspension of mononuclear immune cells that were analyzed by scRNAseq. Alternatively, uninfected and infected cerebral cortices harvested at 6 dpi were fixed and processed for analysis by spatial transcriptomics. Created with BioRender.com.

Williams et al. recently investigated the dynamics of the host response to VEEV infection in the mouse brain using bulk RNA sequencing (RNAseq) and histological techniques (22). We reanalyzed the bulk RNA-seq data obtained from three different regions of the brain: 1) the main olfactory bulb (MOB) where robust expression of viral protein was detected as early as 1 dpi, 2) piriform cortex (PIR), a region with robust viral protein expression by 2 dpi and 3) hippocampus (HIP), a region showing strong viral protein expression by 4 dpi (22). This data showed that Ifih1 and Ddx58 were upregulated immediately after infection in all three regions, which was followed by upregulation of type I IFN genes including Ifna2, Ifna4, Ifna5 and Ifnb1 (Supplementary Figure 1B). Interferon expression decreased over time in all three regions. Consistent with the decrease in resting microglia observed in our scRNAseq data, a dramatic decrease in the expression of microglia markers Cx3cr1, Tmem119, P2ry12 and Fcrls was observed while several markers of infiltrating myeloid cells including Ly6c2 and Plac8 were upregulated (Supplementary Figure 1B). In addition, a significant increase in the expression of NK and T cell markers over time was also observed in all three regions examined. In alignment with our data, an increase in NK cell markers was observed between 3 and 7 dpi, followed by a significant increase in T cell markers between 5 dpi and 7 dpi (Supplementary Figure 1B). Consistent with the lack of B cells and few neutrophils observed in our scRNAseq data, the expression of B cell and neutrophil markers was extremely low, as shown in the MOB at 6 dpi (Supplementary Figure 1C). We then



FIGURE 2

Temporal profiling of immune cells in the brain by scRNAseq in VEEV infection. (A) Uniform Manifold Approximation and Projection (UMAP) visualization of cell clusters identified in each experimental group. Cell clusters are color-coded and numbered. (B) Dot plot showing the expression of select cell-type markers. Dot size represents the fraction of cells of the indicated cluster expressing the markers and the intensity of color represents the average marker expression level in that cluster. (C) The relative proportion of cell types within brains of each experimental group. (D) Line graph representation of the change in proportion of prominent cell types over time in uninfected and infected brains. (E) Flow cytometry gating scheme applied to immune cells isolated from uninfected and VEEV-infected brains. Plots show cells isolated from a representative brain at 6 dpi. Microglia were identified as CD45^{Int} CD11b^{Int} To distinguish CD45^{bil} CD11b⁺ myeloid cells from NK cells that also express CD1b, we identified these cells as CD45^{hil} CD11b⁺ CD49b⁻. The remaining cells were labeled as lymphocytes. LyGC expression was also confirmed in myeloid cells. (F) Percentages of lymphocytes and myeloid cells. Data are shown as mean \pm SEM (n= 4-7). Experiments were repeated at least twice. Two-tailed p values were calculated using one-way ANOVA with Tukey's correction for multiple comparisons.

reanalyzed the expression of interferon and markers of the key infiltrating populations in all eight parts of the brain isolated by Williams et al., (MOB, PIR, striatum (STR), motor cortex (MTX), HIP, sensory cortex (STX), thalamus (THA), and cerebral cortex (CBX). High expression of type I IFN genes was observed earliest in the MOB and PIR, at 3 dpi, followed by STR, MTX, HIP, STX, and THA across 5 and 6 dpi (Supplementary Figure 1D). Ly6c2 was upregulated in the MOB from 3 through 7 dpi whereas it was upregulated from 5 to 7 dpi in the PIR, STR, MTX, HIP, STX, and THA. NK cell and T cell markers were upregulated highest from 5 to 7 dpi in the MOB, and PIR, and at 7 dpi in the MTX, HIP, STX, and THA. Expression of these markers was least changed in the CBX across all timepoints. The early expression of viral sensing genes and type I IFN genes in the bulk RNAseq data set preceding high expression of markers of infiltrating cells coincides with our scRNAseq data that implicates microglia as a key early responder to VEEV infection and early producer of interferon. Both data sets then indicate a sequential recruitment of myeloid cells followed by lymphocytes at later timepoints. The bulk RNAseq data set demonstrates that in addition to temporal differences, there are unique spatial signatures of gene expression that can potentially help define the progression of the immune response through specific regions of the brain over time and the extent of infiltration in each of these regions.

Microglial and myeloid cell subtypes elicit heterogeneous antiviral responses following VEEV infection

To further examine the transcriptional activity of microglia and infiltrating myeloid populations, all cells from clusters 0, 1, 3, 5, 7, and 8 (Figure 2A) were extracted and re-clustered using an unsupervised clustering approach. This included the following number of cells for each condition: Uninfected: 2,211, TC-83 2 dpi: 1,527, TC-83 4 dpi: 3,835, and TC-83 6 dpi: 3,398. Analysis revealed 10 unique cell clusters (Figures 3A-C). Microglial subpopulations (cluster 0; resting MG, cluster 3; activated MG 1, and cluster 5; activated MG 2) clustered apart from various infiltrating myeloid populations and exhibited enrichment for Cx3cr1, Trem2, and Tmem119, as well as complement component genes C1qa-c. Cluster 1 and 2 highly expressed monocyte/ macrophage markers Ly6c2 and Plac8, while lacking Tmem119 and were, therefore, annotated as 'monocyte/macrophage (Mono/ Mac) 1' and 'Mono/Mac 2,' respectively (Figure 3C; Supplementary Figure 2A) (31, 32). Clusters 4, 7, and 8 were identified as Cd209a⁺, plasmacytoid, and Ccr7⁺ DCs, respectively, based on enrichment of specific genes such as Cd209a and class II MHC genes Cd74, H2-Aa and H2-Ab1 (cluster 4), Klk1 and Mctp2 (cluster 7) and Ccr7 (cluster 8) (Figure 3C; Supplementary Figure 2) (33). Cluster 9 expressed neutrophil markers S100a8 and S100a9 (Figure 3C).

To understand the function of the myeloid clusters, we analyzed expression of key antiviral response genes. Type I IFN genes *Ifnb1* and *Ifna2* were primarily expressed by microglia, specifically activated MG 1 (Figure 3D). Elevated levels of interferon stimulated genes were observed across other myeloid subclusters,

mainly Mono/Mac 1 and 2 and Cd209a⁺ DCs as early as 2 dpi, but more notably at 4 dpi and through 6 dpi (Figures 3D, E). Activated MG 1 were also enriched for inflammatory cytokines Ccl3 and Ccl4, Csf1, a key regulator of macrophage differentiation, tumor necrosis factor alpha (Tnf), and Il12b, a cytokine that acts on T and natural killer cells (Figure 3G). Ifnb1 and Csf1 elevation was observed by 2 dpi and through 6 dpi, in a small (< 20) percent of total cells (Figure 3F), while the other cytokines were observed highly expressed by greater percentages of total cells and beginning at 4 dpi, through 6 dpi. Activated MG 2 exhibited elevated Ifna2 expression, though lower than activated MG 1 and not until 6 dpi (Figure 3D; Supplementary Figure 1A), and were enriched for Ccl5, Ccl7, Ccl12, Cxcl16, and Cxcl13 (Figure 3G). Mono/Mac 1 shared overlap with activated MG 2 with enrichment for Ccl5, Ccl7, and Cxcl16, and additionally expressed high levels of Ccl8. Mono/Mac 2 expressed high levels of chemokines including Ccl2, Ccl6, Ccl9, Cxcl1, Cxcl2 and Cxcl10, as well as Il15 and Il18, two interleukins implicated in activation of T/NK cells (Figure 3G) (34-36). Mono/ Mac 1 also exhibited elevated expression of Il15 and Il18, but to a lesser extent. Notably, Cd209a⁺ DCs had high expression of Cxcl9, a prominent mediator of lymphocyte infiltration (Figure 3G). We validated our transcriptomic data by measuring protein levels of a subset of cytokines and chemokines included in our analysis in brain homogenate isolated from infected mice. Consistent with the observed increase in gene expression, IL-1β, IL-6, CXCL1, CXCL2, CXCL10, CCL5 and IFN- β were upregulated at the protein level in infected brains (Figure 3H).

To investigate the relationship between myeloid subclusters, we performed trajectory analysis, ordering single cells along pseudotime to reconstruct potential differentiation trajectories (Supplementary Figure 2B). Mono/Mac and microglia subpopulations clustered distinctly through each timepoint. Microglia clusters exhibited a shift from resting to activated subpopulations. By 4 dpi, activated MG 1 partially occupy a shared branch with Mono/Mac clusters. Meanwhile, activated MG 2 and proliferating cells occupy distinct branches. Interestingly, only a small portion of activated MG 1 highly express *Ifnb1* at each timepoint (Supplementary Figure 2C).

Infiltrating myeloid cells occupy specific spatial niches in the brain

Having established that microglia subclusters and infiltrating myeloid cells display distinct inflammatory profiles in response to VEEV infection, we next asked whether the spatial distribution of these immune cell subtypes also differ in the brain parenchyma using spatial transcriptomic analysis performed at 6 dpi. Unsupervised clustering of the spatial transcriptomic data from uninfected and infected brains resulted in eleven clusters. The majority of these clusters corresponded to specific anatomical regions in the brain (Figures 4A–C). Cluster 2 showed enrichment for myeloid markers such as *Ly6c2* and *Plac8* and was localized at the periphery of the cortex and within the hippocampal region (Figures 4C–F). The uninfected brain had significantly fewer cells from cluster 2 compared to the infected brain at 6 dpi



(Figures 4E, F). Examination of spatial expression patterns of *Ly6c2* and *Plac8* further revealed a distinct localization of myeloid cells expressing these genes in the periphery of the cortex and within the hippocampal region of infected brains (Figure 4G). Localized Ly6c was confirmed in these regions via immunohistochemical analysis (Figure 4I). Minimal Ly6c expression was noted in the uninfected

brain and robust signal was detected in the infected brain concentrated around the hippocampal formation (Figure 4I). When compared to the localization patterns of *Prox1*, which appears enriched at the hippocampal formation, and *Nrgn1*, within the cortex, the expression of the myeloid-specific markers appears to distinctly localize at a layer in between the *Prox1*- and

Nrgn1-high regions, within the hippocampal region (Supplementary Figure 3D, Figure 4G). Our re-analysis of the bulk RNAseq data set generated by Williams et al. also indicated greater immune infiltration, including myeloid populations, within the hippocampus compared to the cortex (Supplementary Figure 1D). Expression of several upregulated chemokines in the infected brain including *Ccl2*, *Ccl4*, *Ccl5*, *Ccl7* also localized to regions enriched in myeloid cells whereas *Tnf* and interleukins including *Il6*, *Il12b*, *Il15* and *Il18* were detected throughout the brain (Figure 4C; Supplementary Figures 3A, B). Interestingly, *Cxcl10* had a more robust expression throughout regions of the infected brain where we did not observe high *Ly6c*, suggesting that *Cxcl10* is primarily expressed by cells other than the localized myeloid subpopulation (Supplementary Figure 3C). Consistent with the scRNAseq data, there was a significant reduction in cells

expressing markers of homeostatic microglia such as Cx3cr1 and Tmem119 and an increase in cells expressing Cd72, a gene enriched in activated microglia, in infected brains (Figure 4H). These data indicate that by 6 dpi, there is widespread activation of microglia and regional specificity in infiltrating myeloid subpopulations.

Recruited NK and CD8⁺ T cells showed a widespread distribution in the brain parenchyma and elevated expression of cytotoxic proteins

To gain a more comprehensive understanding of lymphocyte responses to infection, all cells from lymphocyte clusters (clusters 2, 4 and 6; Figure 2B) were extracted and reanalyzed. This included the



FIGURE 4

Spatial transcriptomic profiling of myeloid populations in the brain during VEEV infection. $5-\mu$ m coronal sections through the hippocampus were derived from uninfected mice or infected mice at 6 dpi. Sections were used for either ST (A–H) or immunostaining (i). Distribution of transcriptionally unique populations detected in uninfected (A) or infected (B) brains. Populations are numbered and color-coded. (C) Annotation of major brain regions. MB, midbrain; HPF, hippocampal formation; CTX, cortex. (D) Dot plot showing expression levels of identifying markers of cell types across the brain. Dot size represents the fraction of cells in the indicated cluster expressing the markers and the intensity of color represents the average marker expression level in that cluster. Distribution of cluster 2 is shown in uninfected (E) or infected (F) brains. Distribution of select myeloid gene and cytokine expression (G) and microglial gene expression (H). (I) Representative images of Ly6C staining in the hippocampus (magnification = 20).

following number of cells for each condition: Uninfected: 66, TC-83 2 dpi: 89, TC-83 4 dpi: 987, and TC-83 6 dpi: 2,783. Cells were primarily identified as one of two subclusters of NK cells, referred to as NK cells 1 and 2, $CD8^+$ T cells, $CD4^+$ T cells, or smaller detected clusters of $\gamma\delta$ T

cells and cells expressing markers of proliferation (Figure 5A). At both 4 and 6 dpi, NK cell clusters composed a greater proportion of total lymphocytes than CD8⁺ and CD4⁺ T cells, which exhibited a steep increase at 6 dpi (Figures 5B, C). High expression of genes encoding



FIGURE 5

Analysis of lymphocyte populations in the brain by scRNAseq and spatial transcriptomics. UMAP visualization of lymphocyte clusters colored by identity (A) or experimental group (B). (C) Proportions of lymphocyte populations. (D) Violin plots showing expression of cytotoxic genes across experimental groups. (E) Violin plots showing expression of select NK and T cells genes within the indicated subpopulations. Colors indicate timepoint post infection. (F) Spatial distribution of select NK and T cell genes in uninfected or infected brains at 6 dpi. (G) Representative flow cytometry plots showing perforin expression in NK and T cell populations in the brain at 6 dpi or in an uninfected control. Quantification of NK and T cells in the brain at 4 and 6 dpi is shown in (H) and perforin positive cells in the brain versus spleen at 6 dpi in (I). (J) Protein analysis of IFN- γ in uninfected or infected brains at 6 dpi. Data in H–J are shown as mean \pm standard error of mean (SEM) (n=4-7). Two-tailed p values were calculated using 2-way ANOVA with Bonferroni's correction for multiple comparisons (H, I) or unpaired Student's t test (J).

cytotoxic proteins, including perforin, granzyme B, and FasL, were observed at both 4 and 6 dpi (Figure 5D). Perforin and granzyme genes (Prf1 and Gzmb, respectively) were expressed in both NK subclusters and CD8⁺ T cells at both timepoints, with NK cells exhibiting higher expression (Figure 5E). While expression in NK cells was comparable for both timepoints, CD8⁺ T cells exhibited higher expression of Prf1 and Gzmb at 6 dpi. Additionally, Ifng expression was detected in both NK sub clusters and CD8⁺ T cells, each exhibiting higher expression at 4 dpi. Production of perforin at 6 dpi was also observed by flow cytometry and IFN- γ by protein analysis (Figures 5G–J). Perforin protein was detected in NK cells and CD8⁺ T cells, but not CD4⁺ T cells (Figure 5I). Further, perforin protein was significantly higher in the brain than spleen in both cell types, suggesting unique cytotoxic effector expression in the brain versus systemically. An increase in the expression of NK cell inhibitory genes such as Klrc1 and Klrd1 was observed in both NK and CD8⁺ T cells at 6 dpi (Figure 5E). This together with the decreased Ifng expression at 6 dpi may indicate NK cell exhaustion around the later timepoint. Spatial transcriptomic analysis at 6 dpi revealed detection of NK and T cell associated genes throughout the brain with no observable specific localization patterns, though, Ifng expression sometimes formed concentrated clusters (Figure 5F). These results indicate a robust and ubiquitous upregulation of cytotoxic effectors throughout the brain in response to VEEV infection that coincide with timepoints of severe neurological dysfunction.

Comparative analysis of infected brain and peripheral blood mononuclear cells reveals distinct immune landscapes

To compare the immune landscape in the brain to systemic immune changes induced by VEEV infection, we profiled peripheral blood mononuclear cells (PBMCs) from infected and uninfected mice at 6 dpi using scRNAseq. Our analysis identified twelve immune cell clusters including NK cells, T cells, B cells, mono/macs, neutrophils, DCs and plasma cells (Figures 6A-C). Consistent with our findings in the brain, the proportion of NK cells dramatically increased in the blood after infection (Figure 6D). Mono/Macs also expanded in both the infected blood and brain (Figures 3C, D, 6D). In contrast to what we observed in the brain, T cells 1, which encompassed CD4⁺ T cells and regulatory T cells, decreased and the proportion of CD8⁺ T cells remained similar between infected and uninfected blood (Figure 6D). Neutrophils, which were identified in the brain at only small relative abundance, dramatically expanded in the blood after infection and upregulated antiviral response genes, including Ddx58, Ifih1, Ifit1, Ifit2 and Isg15 (Figure 6E). Blood Mono/Macs and DCs also activated a large number of antiviral response genes in response to infection (Figure 6E).

Next, we compared infection-induced transcriptional changes in PBMCs to immune cells from the brain (Supplementary Figures 4A, B). Similar to the brain, blood Mono/Macs from infected mice activated *Plac8*, *Ly6c2* and cathepsin family proteases (Supplementary Figure 4C). We found that cytokines such as *Ccl2*, *Ccl5* and *Ccl7* had markedly lower expression in infected blood Mono/Macs compared to brain Mono/Macs while Ccr2, a receptor involved in myeloid recruitment to the CNS, had an elevated expression in blood Mono/Macs (Figure 6F; Supplementary Figure 4C) (37). Peripheral blood NK cells from infected mice expressed perforin, granzymes, cytokines and inhibitory receptors at a level comparable to NK cells from infected brains, with slightly higher Gzmb expression in the infected brain (Figure 6G). Interestingly, uninfected blood NK cells also had robust expression of Prf1 and Gzma but, not Gzmb. The expression levels of perforin and granzymes were also upregulated in CD8⁺ T cells after infection (Figure 6H). Unlike uninfected NK cells, uninfected blood CD8⁺ T cells did not express Prf1 or Gzma, suggesting that cytotoxic gene expression in CD8⁺ T cells was infection-induced (Figure 6H). Overall, these findings emphasize a tissue-specific upregulation of cytotoxic effectors as a potential key component of the immune landscape in the brain in response to VEEV infections.

Discussion

Existing and emerging encephalitic viral infections pose a growing medical challenge. Viral infection of the brain and subsequent inflammatory immune responses can cause long lasting or permanent damage leading to serious clinical outcomes and death. Lethal encephalitis that ensues following VEEV infection is attributed to the host immune response to viral replication in brain tissue, but it remains unclear which specific components of the immune response instigate disease (7-9, 11, 38, 39). Thus, understanding the processes involved in the recruitment, differentiation, and function of immune cells in the brain during infection is of high importance to aid the development of novel therapeutics that target immunopathological responses. Our data captures the emergence of microglia subpopulations that deviate from a resting or homeostatic state to activated states marked by interferon expression and immune cell recruiting cytokines. Subsequently, we characterized a large infiltration of monocytederived cells that comprise subsets expressing signatures of interferon response, inflammatory, and lymphocyte recruitment genes. Late and lethal timepoints were then marked with massive infiltration of NK and CD8⁺ T cells expressing high levels of cytotoxic genes. Our data corroborates and provides more transcriptional detail to previous work implicating resident and infiltrating immune cells as mediating neuroinflammation through the expression of inflammatory cytokines and chemokines across transcriptionally distinct subsets.

The specific roles of microglia in damage and repair are diverse across different scenarios of inflammation (40, 41). In the context of viral encephalitis, both protective (42) and pathogenic (43) roles of microglia have been described. The double-edged sword of microglia is apparent in these studies that highlight their importance in viral clearance while simultaneously contributing to neuroinflammation through recruitment. We observed a dynamic response to VEEV in microglia over the course of infection. The emergence of two subpopulations of microglia was observed by 2 dpi that we termed activated microglia (MG) 1 and 2. Trajectory analysis revealed their simultaneous expansion,



Comparative scRNAseq analysis immune cells in the brain and PBMCs during VEEV infection. UMAP visualization cell clusters in the blood at 6 dpi colored by identity (A) or treatment (B). (C) Expression of identifying markers across clusters. (D) Relative proportions of populations. (E) Heat map showing expression of select antiviral response genes across cell populations in uninfected versus infected blood. Comparison of the expression of select genes in mono/mac (F), NK cell (G) and CD8⁺ T cell (H) populations in the brain versus blood.

suggesting they are uniquely activated subpopulations. Notably, activated MG 1 was the primary cell type expressing genes encoding RIG-I (Ddx58) and MDA5 (Ifih1), PRRs important in alphavirus sensing, along with type I IFN genes Ifnb1 and Ifna2 throughout infection. Activated MG 2 did not exhibit elevated Ddx58 or Ifih1 but showed elevated Ifna2 expression at 6 dpi. Interestingly, within activated MG 1, only a small portion of the population expressed Ifnb1 at each timepoint. While VEEV primarily infects neurons and astrocytes, it can also infect microglia to a lesser frequency (9). It is possible that the unique expression profiles among microglia may represent infected cells versus bystander cells assuming an antiviral state, or alternatively, concurrent molecular pathways could contribute to limiting Ifnb1 expression. Moreover, microglial activation may be orchestrated by other cell types that are directly sensing virus. Accordingly, it has been reported in a model of vesicular stomatitis virus (VSV) that IFNAR signaling in neurons and astrocytes regulated the response of microglia (44), and endothelial cells have been shown to promote inflammation via differential regulation of adhesion molecules following VEEV infection (8).

The progression of microglia during infection from homeostatic to antiviral and immune cell recruiting states has been noted in other studies. Spiteri et al. performed scRNAseq on microglia and monocyte-derived cells isolated from the brains of West Nile virus (WNV)-infected mice and similarly described a temporal transition of microglia, with expression of immune cell-recruiting genes that overlap with our data, including *Ccl4*, *Ccl5*, and *Ccl7* (45). A bulk RNA sequencing study of microglia and infiltrating macrophages from Theiler's murine encephalomyelitis virus-infected brains similarly found elevated cytokines in microglia with overlap in macrophages, which we also observed (46). We found MG1 and 2 to overlap in expression of *Ccl5*, *Ccl7*, and *Cxcl13*, while only activated MG 1 highly expressed proinflammatory factors *Tnf, Csf1*, and *Il12b*. Activated MG 2 also had elevated *Ccl2* and activated MG 1 had elevated *Ccl3* and *Ccl4*. Spiteri et al. also show depletion of microglia or monocyte-derived cells in the WNV model lessened infiltration of other immune cells, including NK and T cells, further indicating the role of microglia in myeloid cell and lymphocyte recruitment during viral infections. They show this to have a neuroprotective effect, whereas microglia were protective in the model of VSV (44, 45). In mouse hepatitis virus, a neurotropic coronavirus, depletion of microglia exacerbated disease and resulted in a defective T cell response (42). The role of microglia in viral clearance, the recruitment of lymphocytes, and subsequent functions of those cells in VEEV as compared to other neurotropic viruses should continue to be elucidated.

Activated MG 1 and 2 share expression of cytokines with important roles in the recruitment of inflammatory monocytes (47-49). Ly6C^{hi} monocytes have been shown to play both protective and pathogenic roles upon migration to the brain (50-55). In our data set, greater than 30% and 40% of immune cells in the brain are infiltrating myeloid cells by 4 and 6 dpi, respectively, consisting mostly of two Ly6c2 expressing subpopulations (Mono/ Mac 1 and 2) that display high induction of numerous ISGs, cytokines, and chemokines. Trajectory analysis indicated Mono/ Mac 1 and 2 cluster separately throughout each timepoint, likely ruling out either population being a precursor state to the other. Notably, this large myeloid infiltration coincides with peak viral replication and the appearance of clinical signs and future studies should investigate the mechanistic role of these cells in VEEV infection. Other notable myeloid cell populations that responded to infection include neutrophils and DCs. Both cell populations expanded in the blood and expressed high levels of antiviral genes in response to infection, yet only DCs were detected at appreciable levels in the brain. The low relative abundance of neutrophils in the brain suggests they are not specifically recruited to the brain in response to VEEV infection, which is notable given the dramatic expansion in the blood during VEEV infection and infiltration into the brain during other neurotropic infections, including with other neurotropic arboviruses (56). The expansion of neutrophils in the blood and their high expression of antiviral response genes may indicate a role in systemic viral clearance.

Lymphocyte populations exhibited diverse responses upon infection, with subset populations demonstrating brain-specific cytotoxic signatures. NK cells expanded considerably in the brains and blood of infected animals, and T cells exhibited a sharp increase in the brain at 6 dpi. Conversely, B cells decreased proportionally in the blood upon infection and did not infiltrate the brain. Both NK cells and CD8⁺ T cells from infected animals expressed elevated levels of cytotoxic genes, with higher expression observed within brain-infiltrating cells. While blood NK cells exhibited similar levels of *Prf1* and *Gzma* expression as in the brain, brain NK cells exhibited higher *Gzmb*. Notably, *Gzmb* exhibits a lower baseline expression in blood NK cells than *Gzma*, therefore the high level of *Gzmb* observed in the brain following infection represents a dramatic shift from baseline expression. Furthermore, striking differences in perforin expression in NK and CD8⁺ T cells were observed between cells isolated from brains versus spleens via flow cytometry, with brain populations of both cell types exhibiting significantly higher expression. Therefore, the highly cytotoxic state of brain infiltrating NK and CD8⁺ T cells is a specific quality and may be significantly contributing to immunopathology. Notably, previous work has implicated NK cells in the pathogenesis of VEEV in mouse models and the cytopathic effects of NK and T cells have also been implicated in neuroinflammation and blood brain barrier (BBB) disruption in non-infectious contexts (15, 57, 58). Recruitment of CD8⁺ T cells in WNV infection is coordinated by neuronal CXCL10, which we observe abundantly expressed throughout the brain and speculate it is largely expressed by brain resident cells during VEEV infection. While CD8⁺ T cells promote clearance of WNV, this has not been demonstrated in VEEV (59). Further, T cell signaling to microglia in models of encephalitis recovery was found to drive cognitive sequelae post-WNV and Zika virus infection (60).

The abundantly present cytotoxic lymphocytes are potential key effectors of damage in the brain during VEEV infection and, therefore, appealing therapeutic targets via blockade of their recruitment or function.

A key feature of our data is the unique spatial localization of infiltrating Mono/Mac cells within the brain on 6 dpi. A Ly6c2expressing myeloid cluster was found to occupy a distinct regional pattern that lined the cortex perimeter and a region surrounding the hippocampal formation. In contrast, T and NK cells exhibited no clear localization pattern and were distributed throughout the brain. These data suggest fundamental differences in the mechanisms governing myeloid and lymphocyte infiltration into the brain. NK and T cells may require breakdown of the BBB in order to infiltrate in significant numbers, reflected in their widespread distribution throughout the brain, whereas myeloid cells may traverse alternate barriers (choroid plexus, glia limitans) at earlier time points. The mechanisms that control myeloid cell extravasation into the brain parenchyma across any barrier have been described in noninfectious contexts including autoimmune, traumatic, and neurodegenerative inflammation, demonstrating distinct paths that may influence functional roles in damage and tissue repair (61-64). In spinal cord injury, Ly6c^{hi} monocytes home to the CNS via spinal cord leptomeninges whereas Ly6c^{lo} monocyte-derived resolving macrophages trafficked through the blood-cerebral spinal fluid barrier, brain-ventricular choroid plexus, or epithelial transmigration, indicating a link between entry route and function (64). It is possible that the accumulation of Ly6c^{hi} monocytes we observe is at the meninges, contributing to extravasation to the hippocampal formation. Monocyte accumulation in the hippocampus can be damaging and drive cognitive deficits during viral encephalitis (65). Additional research into infiltration mechanisms during viral infection and how the localization of these cells contributes during encephalitis is critical. The relationship between localized viral replication within the brain and the proximity to clustered immune populations also warrants further investigation. Notably, concentrated infected/ apoptotic neurons have been observed in the hippocampus in VEEV-infected mice (66). In turn, the Lyc62-expressing cluster

likely contributes to further inflammation, as these cells exhibited high expression of chemokines, including *Ccl2*, *Ccl4*, and *Ccl7*. The role of each cell population and features such as their localization, expression profiles, and temporal infiltration during VEEV pathogenesis are of keen interest for follow on studies.

In summary, this study provides a comprehensive profiling of transcriptional activity of immune cells in the brain during viral encephalitis. We define the heterogeneity of the immune response in the brain at three timepoints post-VEEV infection, tracing the activation of resident cells, infiltration of cells from the periphery, and the emergence of various subpopulations. We compared the brain gene expression data to that of PBMCs to underscore brainspecific changes. Spatial transcriptomics identified localization of an infiltrating myeloid population to discrete regions of the brain, and furthermore highlighted distinct localization patterns of myeloid cells and lymphocytes. Future studies should utilize the data provided here to further define the immunopathogenic components of the response to VEEV versus those that are protective to inform the development of vaccine and therapeutic candidates.

Data availability statement

The datasets presented in this study can be found online on the Gene Expression Omnibus(GEO; : https://www.ncbi.nlm.nih.gov/geo/). The accession numbers can be found below: GSE275201 and GSE274566.

Author contributions

MR: Conceptualization, Data curation, Investigation, Methodology, Visualization, Writing – original draft, Writing – review & editing. AS: Conceptualization, Data curation, Formal analysis, Visualization, Writing – original draft, Writing – review & editing. NL: Data curation, Investigation, Visualization, Writing – review & editing. AP: Investigation, Writing – review & editing. BG: Data curation, Formal analysis, Investigation, Writing – review & editing. NH: Conceptualization, Investigation, Writing – review & editing. DW: Conceptualization, Data curation, Funding

acquisition, Investigation, Methodology, Project administration, Supervision, Writing – original draft, Writing – review & editing.

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Conflict of interest

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

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Supplementary material

The Supplementary Material for this article can be found online at: https://www.frontiersin.org/articles/10.3389/fimmu.2024.1497839/ full#supplementary-material

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