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# OMIP-054: Broad Immune Phenotyping of Innate and Adaptive Leukocytes in the Brain, Spleen, and Bone Marrow of an Orthotopic Murine Glioblastoma Model by Mass Cytometry

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### PURPOSE AND APPROPRIATE SAMPLE TYPES

Here we present a 42 parameter panel to characterize myeloid immune cell subsets and T lymphocyte activation status in cryopreserved and barcoded single cell suspensions obtained from brain, spleen, and bone marrow of an orthotopic immunocompetent glioblastoma mouse model in a C57BL/6 background (Table 1). This panel is designed for mass cytometry by time of flight (CyTOF) and combines 34 antibodies against diverse cell surface and intracellular targets together with cisplatin for live/dead discrimination, iridium for cell identification, and six cellular barcodes (1) to enable simultaneous multiplexed acquisition of up to 20 samples (Table 2). The panel is designed for a comprehensive evaluation of the immune system in different organs during murine in vivo studies in the field of glioblastoma immunology, but could also be applied to other disease models in the central nervous system (CNS) with possible systemic involvement, such as brain metastasis arising from other types of cancer, experimental autoimmune encephalomyelitis (EAE), or neurodegenerative disease models. Marker selection was partly based on a combination of previously reported panels studying CNS immune infiltrates (2-7). The selected set of markers captures T lymphocytes (CD8+, CD4+, and regulatory T lymphocytes), dendritic cells (DC), monocytes, macrophages, microglia, tumor cells (when GFP positive), and granulocytes, and contains a set of antibodies to detect cell activation, migratory capacity and immune checkpoints (Table 2). The panel has been optimized with respect to marker selection, antibody clone usage, antibodymetal pairing, and antibody concentration, and has room for additional markers by filling in a number of free channels as listed in Table 2.

#### BACKGROUND

In the last decades enormous efforts have been made to develop therapeutic interventions that boost antitumor immunity, including adoptive cell transfer, anticancer vaccination, application of oncolytic viruses, and immune checkpoint inhibition (8,9). A wide range of immunotherapeutic strategies are being tested in glioblastoma, advanced by successes in other tumor types. In these approaches particularly T cells are targeted as final effector cells by, for example, dendritic cell vaccination or immune checkpoint inhibition, but durable responses remain limited to case reports (10). Boosted T cell responses as a result of, for example, vaccination strategies encounter functional impairment due to immune inhibitory mechanisms both in the tumor microenvironment and systemically. To overcome T cell inhibition hope was pinned on immune checkpoint inhibition with monoclonal antibody therapy against PD1 and CTLA-4. Nevertheless, to date clinical trials testing immune

Table 1. Summary table for the application of this OMIP

PURPOSE	IMMUNOPHENOTYPING OF INNATE AND ADAPTIVE IMMUNE CELLS IN A MURINE GLIOBLASTOMA MODEL
Species Cell types Cross-references	Mouse Single cells from Miltenyi neural tissue dissociation kit (P) treated brain No similar OMIP

checkpoint inhibition in glioblastoma have not shown impressive results (11). Clearly glioblastoma-specific immune suppression is a complex and unsolved problem that remains an obstacle for successful immunotherapies. Therefore, a better understanding of glioblastoma immune escape and contributing factors is warranted, alongside the development of biomarkers for patient selection and prediction of clinical response. Immune suppression in glioblastoma is largely mediated by infiltration of monocytes into the glioblastoma microenvironment (12). Myeloid immune cells dominate immune infiltrates and are involved in glioblastoma disease progression (13-15). Although some subsets have been studied in isolation, the different types of infiltrating myeloid and lymphoid cells, their recruitment from the bone marrow and spleen, and their phenotypic distribution need further investigation.

Mass cytometry provides for the simultaneous measurement of more than 40 parameters at single cell resolution, improving the ability of cytometry to characterize the complexity of the immune system (16). Similar to the development of antibody panels for multichromatic fluorescence cytometry, mass cytometry panel development requires optimization of antibody-metal pairing, conjugation of antibodies with metal polymers, determination of optimal antibody concentrations, and optimization of buffers and staining conditions. Here we developed a mass cytometry immunophenotyping panel, which was designed to quantify population frequencies and to infer functional states of T cells, including activation, differentiation, exhaustion, or anergy in the murine glioblastoma microenvironment (Fig. 1) and spleen. Furthermore, our panel helps to differentiate and quantify a multitude of glioblastoma infiltrating and bone marrow derived myeloid cell subsets and immune cells resident to the bone marrow. Although this panel is optimized for single cell suspensions obtained from mouse brain, spleen, and bone marrow it could also be applied to the study of innate and adaptive components of the immune system in other mouse organs. Single cell suspensions were generated using mechanical dissociation and enzymatic digestion using the Neural Tissue Dissociation kit P (Miltenyi, Germany) (17). After live/dead staining and barcoding (1) cells were cryopreserved until antibody staining and mass cytometry analysis (Fig. 1A). Following data pre-processing including bead normalization (18) and debarcoding (1), the first gates aimed at exclusion of normalization beads, cell debris, doublets, and dead cells (140Ce<sup>-</sup>, 193Ir<sup>+</sup>, and 194Pt<sup>-</sup>). Next, we plotted CD45 against CD11c to identify CD45<sup>hi</sup>CD11c<sup>hi</sup> DCs (population 1). Plotting CD45 against CD11b for non-DCs resulted in four main populations: CD45<sup>-</sup> non-immune cells (population 2), lymphocytes, CD45<sup>+</sup>CD11b<sup>+</sup> CD45<sup>+</sup>CD11b<sup>-</sup> infiltrating mveloid cells, and CD45<sup>dim</sup>CD11b<sup>+</sup> microglia. CD45<sup>-</sup> cells include tumor cells and non-immune non-tumor brain resident cells, such as glial cells or neurons. In the CD45<sup>+</sup> CD11b<sup>-</sup>CD3<sup>+</sup>TCRb<sup>+</sup> cells we identified CD8<sup>+</sup> T cells, CD4<sup>+</sup> T cells, and CD4<sup>+</sup>FoxP3<sup>+</sup> regulatory T cells (populations 3, 4, and 5, respectively). Next, we identified microglia as being the CD44<sup>-</sup>CD49d<sup>-</sup> cells in the CD11b<sup>+</sup>CD45<sup>dim</sup> population (population 6). Based on MHC-II, CCR2, and PD-L1 expression we identified three clusters of microglia with different activation states (6A, 6B, 6C). CD45<sup>+</sup>CD11b<sup>+</sup> infiltrating myeloid cells contain granulocytes (population 7), Ly6C<sup>hi</sup>CCR2<sup>hi</sup> recently extravasated monocytes (population 8), and some clusters of macrophages with different phenotypes and/or states of activation (9A, 9B, 9C, 9D, 9E, and 9F) based on their expression of CCR2, MHC-II, PD-L1, CD38, and CD88. Gated populations were identified based on two-dimensional embeddings of the high dimensional space visualized using the viSNE algorithm in Cytobank (Fig. 1B,C).

Enzymatic digestions often result in the cleavage of molecules on the membrane of immune cells, which could have detrimental effect in their recognition by antibodies. In order to allow direct comparison amongst different organs (brain, spleen, and bone marrow) all samples were subjected to the same enzymatic treatment as it was required for the processing of the brain samples. The panel presented in this OMIP has been optimized to the single cell suspension preparation procedure as suggested by the manufacturer with some minor adjustments (see Supporting Information "Online Protocol"). Care should be taken to specifically address any effects of alterations in the tissue dissociation protocol to the performance of this panel.

## SIMILARITY TO OTHER OMIPS

This OMIP is partly overlapping with OMIP-032, which describes two murine multicolor immunofluorescence panels including the following markers to detect B and T lymphocytes, natural killer cells, dendritic cells, macrophages, monocytes, and neutrophils: CD45, TCRβ, CD4, CD8, Ly6C, CD49b, Lv6G, CD11c, MHCII, CD206, NKp46, CD62L, and CD44 (19). These markers overlap with our panel except for CD49b, NKp46, and CD62L. Since our panel is more focused on activation and exhaustion in T lymphocytes, we included more antibodies against activation markers and co-inhibitory molecules (immune checkpoints) rather than the presence of naïve or memory T cells. Also OMIP-031 has overlap with a panel aimed at immune checkpoint expression (20), which reports the following markers: CD3, CD4, CD8, CD69, CD44, CD45RA, CD27, CD62L, KLRG127, CD127, PD-1, CTLA4, TIM-3, LAG-3, and CD45. Our panel includes all of these markers except for CD45RA, CD27, CD62L, KLG127, and LAG-3. Previously, three other mass cytometry panels have been published. They focus on the characterization of human peripheral leukocytes (OMIP-34), human head and neck

TARGET PROTEIN	CLONE	METAL	SOURCE	PURPOSE
Cell identification				
Barcodes		103–110Pd	Fluidigm	Staining standardization and doublet discrimination
Iridium		191–193Ir	Fluidigm	Cell identification
Cisplatin		194–195Pt	Fluidigm	Live/dead discrimination
Cell classification		191 19511	Tulugili	Live, dead discrimination
CD45	30-F11	89V	Fluidiam	All leukocytes
CD3e	145-2C11	152Sm	Fluidiam	Themphoeytes
TCRb	H57-597	169Tm	Fluidigm	T a/b lymphocyte receptor
CD4	RM4_5	145Nd	Fluidiam	T helper lymphocytes
Eovp3 (EIK16s)	FIK-16c	158Gd	Fluidiam	Pegulatory T lymphocytes
CD8b	536 7	168Er	Fluidigm	Cytotovic T lymphocytes
$CD127 (II - 7P_2)$	A 7D 34	1751 1	Fluidiam	Memory T lymphocytes
CD12/(IL-7 Ra)	27 51	175Lu 151Eu	Fluidiam	Themphoryton natural killer celle
	1 / 9	131Eu 141Dr	Fluidigm	r tymphocytes, natural killer cens
Ly-0G		141F1 150NJ	Fluidigm	Managatas maganhagas
$\frac{Ly-oC}{CD11h}$	ПКІ.4 M1/70	150ING	Fluidigin	Monocytes, macrophages
CD11b (Mac-1)	M1//0	148Nd	Fluidigm	Macrophages, microgila, dendritic cells, granulocytes
CDIIC	N418	209Bi	Fluidigm	Dendritic cells
CD14 CD12	Sa14-2	144Nd	Biolegend	Monocytes
	20/70	161Dy	Biolegend	Monocytes, macrophages, neutrophils, eosinophils
MHC class 2 I-A/I-E	M5/114.15.2	1/410	Fluidigm	Antigen presenting cells, 1 lymphocyte activation?
TMEM119	106-6	146Nd	Abcam	Microglia
CD49d	R1-2	176Yb	Biolegend	Exclusion marker for microglia
CD169 (Siglec-1)	3D6.112	142Nd	Biolegend	Dendritic cells, macrophages, microglia
CD206 (Mannose receptor)	C068C2	160Gd	Biolegend	Macrophages, dendritic cells
Siglec H	440c	166Er	Genetex	Plasmacytoid dendritic cells, Microglia
CD38	90	153Eu	Biolegend	B lymphocyte (pre-cursors), macrophages
aGFP	454,505	173Yb	Biolegend	Tumor cells
Migration				
CCR2	475,301	165Ho	RnD systems	Monocyte chemotaxis
CCR6	29-2L17	156Gd	Fluidigm	Dendritic cell- and lymphocyte chemotaxis
CD54 (ICAM-1)	YN1/1.7.4	163Dy	Fluidigm	Leukocyte extravasation
Activation				
Ly-6A/E (Sca-1)	D7	164Dy	Fluidigm	Hematopoietic stem cell marker/ activation of
				lymphocytes
Ki-67	B56	172Yb	Fluidigm	Cell proliferation
CD69	H1.2F3	143Nd	Fluidigm	Activated T lymphocytes
CD44	IM7	171Yb	Fluidigm	Activated lymphocytes
CD150 (SLAM, IPO-3)	TC15-12F12.2	167Er	Fluidigm	Activated lymphocytes and dendritic cells
Immune checkpoints				
CD152 (CTLA-4)	UC10-4B9	154Sm	Fluidigm	Co-inhibitory molecule
CD279 (PD-1)	J43	159Tb	Fluidigm	Co-inhibitory molecule
CD274 (PD-L1)	10F.9G2	155Gd	Biolegend	PD1 ligand
CD366 (Tim-3)	RMT3-23	162Dy	Fluidigm	Co-inhibitory molecule
Free channels		1	0	
		113–115In		
		147Sm		
		149Sm		
		170Er		

**Table 2.** Summary table for the antibodies in this panel

cancer (OMIP-45), and the quantification of calcium sensors and channels in lymphocyte subsets (21–23). This is the first mass cytometry OMIP for a comprehensive characterization of the mouse immune system. All data used generated during the optimization and verification of this panel can be found in FlowRepository under ID: FR-FCM-ZYUF.



**Figure 1.** Identification of main leukocyte populations and CD45<sup>-</sup> cells in murine glioblastoma by manual gating and representation by viSNE. (**A**) Example gating of cell subsets. (**B**) viSNE embeddings color-coded for lineage markers. (**C**) Populations gated in A are color-coded according to the legend inset and displayed in the viSNE map. (**D**) Heatmap describing relative expression of lineage markers across the populations described in A, B, and C. (**E**) Heatmap displaying median mass intensity (ArcSinH(5)-transformed) of activation and migration markers across the populations described in A, B, and C. [Color figure can be viewed at wileyonlinelibrary.com]

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## **AUTHOR CONTRIBUTIONS**

SAD and JV performed experiments. SAD and JV developed and optimized the panel. SAD, JV, and JJGV discussed panel design and optimization. SAD and JJGV wrote the article. The authors declare that they have no conflict of interest.

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