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Author manuscript

*Immunity*. Author manuscript; available in PMC 2024 August 08.

Published in final edited form as:

*Immunity*. 2023 August 08; 56(8): 1825–1843.e6. doi:10.1016/j.immuni.2023.06.017.

## Hypoxic niches attract and sequester tumor-associated macrophages and cytotoxic T cells and reprogram them for immunosuppression

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### SUMMARY

Glioblastoma (GBM), a highly lethal brain cancer, is notorious for immunosuppression, but the mechanisms remain unclear. Here, we documented a temporospatial patterning of tumor-associated myeloid cells (TAMs) corresponding to vascular changes during GBM progression. As tumor vessels transitioned from the initial dense regular network to later scant and engorged vasculature, TAMs shifted away from perivascular regions and trafficked to vascular-poor areas. This process was heavily influenced by the immunocompetence state of the host. Utilizing a sensitive fluorescent UnaG reporter to track tumor hypoxia coupled with single-cell transcriptomics, we revealed that hypoxic niches attracted and sequestered TAMs and cytotoxic T lymphocytes (CTLs), where they were reprogrammed towards an immunosuppressive state. Mechanistically, we identified chemokine CCL8 and cytokine IL-1 $\beta$  as two hypoxic niche factors

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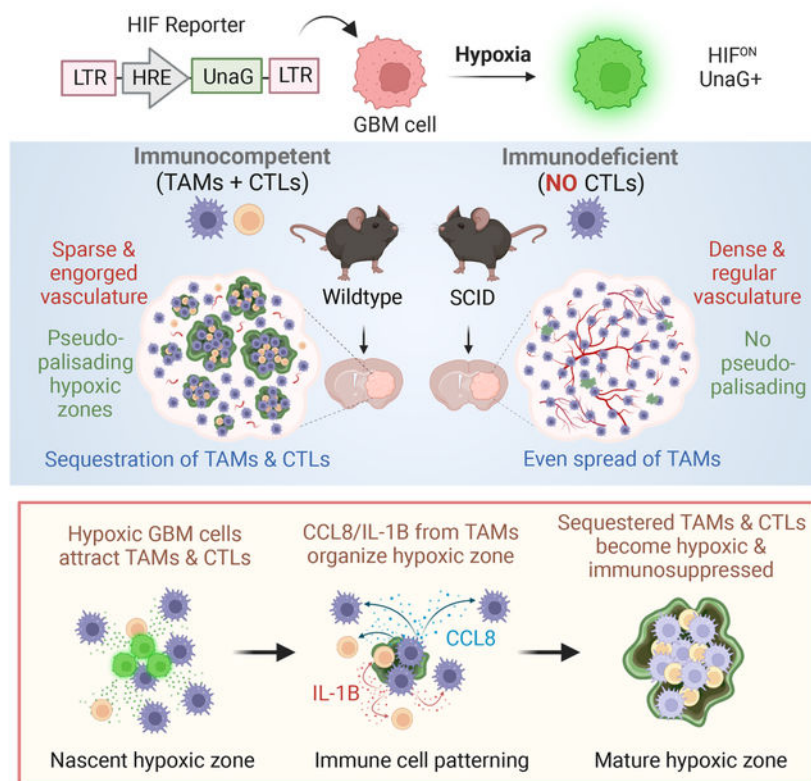
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#### DECLARATION OF INTERESTS

The authors declare no competing interests.

critical for TAM trafficking and co-evolution of hypoxic zones into pseudopalisading patterns. Therefore, perturbation of TAM patterning in hypoxic zones may improve tumor control.

## Graphical Abstract



## eTOC blurb/In brief

Glioblastoma is notorious for immunosuppression, but the mechanisms are unclear. Sattiraju et al. report that hypoxic zones in GBM attract and sequester tumor-associated myeloid cells and cytotoxic T cells, where they are reprogrammed into an immunosuppressive state. This process is influenced by the immunocompetence state of the host and involves CCL8 and IL-1B as niche factors in hypoxic zones.

## Keywords

GBM; immune landscape; tumor-associated microglia/macrophages; TAM; cytotoxic T lymphocytes (CTLs); immunosuppression; tumor hypoxia; tumor vasculature; CCL8; IL-1 $\beta$

## INTRODUCTION

Glioblastoma (GBM), the most common primary brain cancer, remains deadly. A major contributing factor is its immunologically cold status<sup>1</sup>, which poses hurdles for immunotherapy<sup>2,3</sup>. Hence, insights into the governing factors of GBM immunosuppression are needed.

Tumor-associated myeloid cells (TAMs) constitute up to 50% of cells in GBM<sup>4,5</sup>, and they support GBM expansion, angiogenesis, and T cell suppression<sup>6</sup>. Current strategies to target TAMs by either reducing their number or reversing their pro-tumorigenic state are promising in animal models of GBM<sup>7,8</sup>, but no survival benefit has been achieved for GBM patients<sup>9,10</sup>. Thus, mapping the spatial organization of TAMs and dissecting contextual cues may facilitate strategies to disrupt TAM reprogramming.

To delineate the link between TAM patterning and metabolic state of tumor microenvironment (TME), a faithful reporter is crucial to reveal hypoxic niches. Current approaches such as pimonidazole<sup>11</sup>, EF5<sup>12</sup> or PET imaging<sup>13,14</sup> are limited by low cellular resolution, incomplete tissue penetration, and no direct link to hypoxia-inducible factor (HIF), a master transcription factor for cellular adaptation to low oxygen<sup>15</sup>. Genetic HIF reporters using standard fluorescent proteins such as GFP are hampered by the requirement of oxygen for fluorophore maturation. We thus employed UnaG, a fluorescent protein that does not require oxidation to become fluorescent<sup>16</sup>. Indeed, UnaG reporter under the control of HIF response elements (HRE) can faithfully track HIF activity in hypoxic cells<sup>17</sup>.

Here, we transplanted murine GBM cells engineered with a lentiviral HRE-UnaG reporter in a fully immunocompetent background. We charted a temporospatial TAM patterning corresponding to vascular changes, the emergence of hypoxic zones, and subsequent maturation of pseudopalisades. We complemented the spatial information with single cell transcriptomics to reveal signaling communication between GBM cells and immune cells in hypoxic niches, featuring immune cell recruitment and immunosuppression. Validation in human GBM patient samples showed that TAM patterning correlated with glioma grade, hypoxic burden, and mesenchymal subtype. Mechanistically, we demonstrated that immune cell trafficking and maturation of hypoxia zones involved CCL8 and IL-1 $\beta$ . Our findings indicated that targeting TAM patterning in GBM by perturbing hypoxic niches may improve tumor control.

## RESULTS

### Host immune status influences temporospatial patterning of TAMs during GBM progression

To characterize the spatial organization of TAMs in a fully immunocompetent microenvironment, we first studied GL261, a murine orthotopic GBM transplant model in syngeneic C57BL/6 wildtype (B6-WT) background (Figure 1A). Four weeks post-transplant, immunofluorescence (IF) for myeloid marker IBA1 or macrophage antigen F4/80 revealed a highly heterogeneous TAM distribution (Figure 1A). This also applied to TAMs expressing phagocytic marker CD68 or immunosuppression marker CD206 (mannose receptor 1 encoded by *Mrc1*) (Figure 1B). The spatial pattern was also observed for monocyte-derived macrophage (MDMs) labeled by integrin  $\alpha 4$  (CD49d)<sup>18</sup>, which mostly resided in GBM interior, in contrast to microglia (TMEM119<sup>+</sup>) which accumulated largely at tumor periphery (Figure 1C).

As immunodeficient mice are commonly used for patient-derived xenotransplant (PDX) models, we wondered whether the host immune status might affect TAM patterning. We

thus transplanted GL261 cells intracranially into C57BL/6-SCID (B6-SCID) mice that lack functional T and B lymphocytes because of impaired VDJ recombination. We observed a rather uniform distribution of TAMs expressing IBA1, F4/80, CD68, or CD206 (Figures 1D–1E). These findings were further confirmed in ICR-SCID hosts, a common outbred strain of SCID mice (Figure 1F). Hence, the host immunocompetence status exerts a strong influence on the geographic patterning of TAMs.

### TAM patterning parallels vascular changes during GBM progression

The spatial patterning of TAMs in B6-WT hosts was highly dynamic during GL261 expansion: at early stage (2 weeks post-transplant), CD68<sup>+</sup> TAMs were evenly distributed, but by 3–4 weeks they became congregated in distinct zones (Figure 1G). In contrast, CD68<sup>+</sup> TAMs in B6-SCID hosts remained evenly spread throughout GBM progression (Figure 1H).

As blood-borne MDMs constituted the majority of TAMs in GBM interior, we wondered if TAM patterning might reflect vascular rearrangement during GBM expansion. Indeed, we found a drastic difference of tumor vasculature (PECAM1<sup>+</sup>) in B6-WT versus B6-SCID hosts, paralleled by distinct TAM organization (Figures 1G–1I). In B6-WT hosts, tumor vessels progressively transformed from the initial dense and regular network to later sparse, engorged, and tortuous vasculature; in parallel, CD68<sup>+</sup> TAMs shifted from initial perivascular location at 3 weeks (reflecting transvascular influx of MDMs into GBM) to later vascular-poor areas at 4 weeks. In contrast, in B6-SCID hosts, with blood vessels remaining dense and regularly patterned, CD68<sup>+</sup> TAMs remained evenly distributed. Hence, the spatial organization of TAMs coincided with progressive vascular alterations during GBM expansion, and this process was influenced by host immune status (Figure 1J).

### HRE-UnaG reporter reveals the emergence of hypoxic tumor zones

As vascular aberrancy would lead to hypoxia, we next asked if TAM patterning might be associated with the emergence of hypoxic zones in GBM. We thus engineered GL261 cells with a lentiviral HRE-UnaG reporter, with UnaG fused to a PEST degron for fast turnover (Figure 2A). We first confirmed in culture a robust induction of UnaG upon exposure to hypoxia (1% O<sub>2</sub>) and a rapid decline upon return to normoxia (Figure 2B).

We then transplanted GL261-HRE-UnaG cells into B6-WT hosts and detected the emergence of UnaG<sup>+</sup> (HIF<sup>ON</sup>) cells at 2–3 weeks post-transplant in areas distant from blood vessels, which progressively expanded into pseudopalisading patterns, coinciding with vascular alterations (Figures 2C–2E).

UnaG<sup>+</sup> cells highly expressed glucose transporter 1 (GLUT1), a direct HIF target<sup>19</sup> (Figure S1A). We also administered pimonidazole (Pimo), a compound that becomes covalently linked to cellular proteins at low oxygen tension<sup>11</sup>. As compared to Pimo, HRE-UnaG labeled more tumor cells in wider areas, especially in nascent hypoxic zones devoid of Pimo labeling (Figure S1B). In more mature hypoxic zones with distinctive pseudopalisading patterns, UnaG and Pimo signals largely overlapped (Figure S1B). HRE-UnaG thus enabled us to detect nascent hypoxic zones with physiological activation of HIF, in line with its

capability to report HIF activity at 5% O<sub>2</sub> tension and below<sup>17,20</sup>, whereas Pimo mostly labels cells below 1% O<sub>2</sub> tension<sup>21</sup>.

### **TAM patterning parallels hypoxic zone emergence and maturation of pseudopalisades**

Given the marked differences of tumor vasculature and TAM patterning in B6-WT vs. B6-SCID hosts, we next compared UnaG<sup>+</sup> populations, which were highly abundant in B6-WT hosts, but scant in B6-SCID hosts despite advanced tumor sizes (Figure 2F).

The sensitive HRE-UnaG reporter enabled a clear delineation of the spatial relationship of nascent hypoxic zones and the surrounding immune landscape during GBM progression. The spatial transition of CD68<sup>+</sup> TAMs (from initial accumulation around the blood vessels to later confinement in vascular-poor areas) coincided with expansion/maturation of hypoxic zones and pseudopalisades, involving active recruitment, cell-cell sorting, and corralling of CD68<sup>+</sup> TAMs by a rim of UnaG<sup>+</sup> tumor cells in pseudopalisading pattern (Figures 2G–2I).

By contrast, in B6-SCID hosts, small clusters of UnaG<sup>+</sup> tumor cells were found scattered throughout GBM tissues at 2–3 weeks post-transplant (likely reflecting fast tumor expansion outpacing vascular development), but by 4 weeks, they did not mature into large hypoxic zones (Figure S1C), in line with stable tumor vasculature.

TAM patterning in association with hypoxic zones was also observed in two additional mouse GBM models in immunocompetent background: RCAS GBM, an autochthonous GBM model induced with the RCAS avian virus system expressing PDGFB/sh *Trp53*<sup>22</sup>, and CT2A (a syngeneic murine GBM transplant model in C57BL/6 host)<sup>23</sup> (Figures S1D–S1E).

### **Spatial patterning of TAMs in GBM patients correlates with glioma grade and GBM subtype**

To examine whether TAM spatial patterning applies to human GBM, we examined a tissue microarray from 71 glioma patients. Immunostaining for GLUT1 (a HIF target, also independently expressed in vascular cells) demonstrated a positive correlation of hypoxic burden with glioma grade (Figures 3A–3B; Table S1A). Moreover, accumulation of CD68<sup>+</sup> TAMs in GLUT1<sup>+</sup> regions was also in proportion to hypoxic burden (Figures 3C and S1F).

The mesenchymal (MES) transcriptional subtype of GBM is known for worse survival and increased TAM compartment compared to proneural (PN) and classical (CL) subtypes<sup>24,25</sup>. Immunostaining showed that the MES subtype contained more prominent GLUT1<sup>+</sup> pseudopalisades and higher abundance of IBA1<sup>+</sup> TAMs (Figures 3D–3E; Table S1B)<sup>26</sup>. Co-labeling for GLUT1 and CD68 in MES human GBM specimens verified a close spatial association of hypoxia and TAMs (Figure 3F), a finding further corroborated by IF staining on fresh frozen biopsies showing confinement of CD68<sup>+</sup> or CD11b<sup>+</sup> TAMs within GLUT1<sup>+</sup> pseudopalisades (Figure 3G).

### **Targeting hypoxic niches disrupts TAM organization and improves tumor control**

To further link hypoxic zones with TAM patterning, we investigated how targeting hypoxic niches may impact the tumor immune landscape. At two weeks post-transplant, B6-WT mice bearing GL261-HRE-UnaG GBM were treated with radiation therapy (RT), evofosfamide (Evo), a chemotherapy pro-drug activated under hypoxia<sup>27</sup>, or both (RT+Evo)

for 2 weeks. Evo or RT alone reduced tumor burden, but the combined modality achieved even better tumor reduction (Figures 4A–4B).

Regarding tumor hypoxia, RT or combined treatment drastically reduced the UnaG<sup>+</sup> population, whereas Evo treatment alone resulted in a trend of reduction of the UnaG<sup>+</sup> population (Figures 4A–4B). Assessment of tumor vasculature revealed that Evo or combined treatment led to a slightly higher vascular density, while RT did not reduce vascular density (Figures 4A–4B). These findings signify a high radiosensitivity of hypoxic GBM cells and ongoing neoangiogenesis, contrary to the model that RT would increase tumor hypoxia due to radiosensitivity of blood vessels<sup>28</sup>.

We next examined the impact of RT or Evo on the abundance and, importantly, spatial patterning of TAMs. RT or combined treatment increased infiltration of IBA1<sup>+</sup> TAMs with uniform distribution (Figures 4C–4D), coinciding with eradication of UnaG<sup>+</sup> cells and disappearance of pseudopalisades/hypoxic zones after RT. Likewise, after Evo treatment, UnaG<sup>+</sup> pseudopalisading patterns were less defined, as were the spatial patterns of TAMs expressing IBA1, CD68, or CD206. Altogether, tumor hypoxia and TAM patterning influenced one another to co-evolve into pseudopalisading patterns (Figure 4E).

### scRNA-seq reveals immune signaling by hypoxic GBM cells

To explore the ligand-receptor signaling between GBM cells and immune cells in hypoxic vs. non-hypoxic niches, we carried out single cell RNA-sequencing (scRNA-seq) on GL261 HRE-UnaG GBM at 4 weeks post-transplant. The 9 major cell types included GBM cells (76.5%), TAMs (macrophages (11%), microglia (4%)), other immune cells (T cells (4.7%), dendritic cells (1.9%), B cells (0.68%), and mast cells (0.38%)), endothelial cells (0.6%), and a small population of astrocytes (0.3%) (Figures 5A and S2A–S2B).

The HRE-UnaG reporter allowed us to distinguish HIF<sup>ON</sup> and HIF<sup>OFF</sup> cells based on *UnaG* mRNA reads. Indeed, 13.6% of GBM cells were HIF<sup>ON</sup> (UnaG<sup>+</sup>), forming a separate cluster from UnaG<sup>-</sup> cells and displaying a mesenchymal shift in gene expression (Figures 5B and S2C–S2D). This echoed a recent human GBM scRNA-seq study showing an association of MES2 cell state with hypoxia<sup>29</sup>. UnaG<sup>+</sup> GBM cells also appeared relatively quiescent, indicated by downregulation of cell cycle genes (*Rgcc* and *Cdc20*) and reduced proliferative index (6% Ki67<sup>+</sup> vs. 30% in UnaG<sup>-</sup> cells) (Figures 5C and S2E). This resonated with our recent study linking GBM quiescence with HIF signaling<sup>30</sup>.

Further confirming faithful reporting of HIF activity by HRE-UnaG, the top upregulated differentially expressed genes (DEGs) in UnaG<sup>+</sup> GBM cells included many canonical HIF target genes for metabolic adaptation (e.g., *Aldoa*, *Ldha*, *Slc2a1* (encoding GLUT1)), angiogenesis (*Vegfa*), autophagy (*Bnip3*), apoptosis (*Eno1*), and notably, macrophage chemotaxis (*Mif*), and cytokines (*Cxcl10*, *Cxcl9*) (Figure S2E; Table S2A). UMAP feature plots highlighted high expression of *Mif* and *Lgals3* in UnaG<sup>+</sup> GBM cells (Figure S2F), both known to regulate macrophage trafficking and immune suppression<sup>31–34</sup>. MIF also promotes the synthesis of secondary inflammatory cytokines, particularly IL-1 $\beta$  in macrophages<sup>35</sup>, lymphocytes<sup>36</sup>, and neutrophils<sup>37</sup>.



Pathway enrichment analyses by Enrichr, Ingenuity Pathway Analysis (IPA), and Gene Set Enrichment Analysis (GSEA)<sup>38–40</sup> further revealed that aside from metabolism and angiogenesis, gene signatures of UnaG<sup>+</sup> GBM cells exhibited negative enrichment for Type II interferon (IFN) signaling, TNF $\alpha$  and NF- $\kappa$ B pathway, Neuroinflammation signaling, and IFN $\alpha$  and IFN $\gamma$  responses (Figures 5D and S2G–S2H; Table S2B), while upstream regulators included cytokines such as IL1B (Figures S2I). Furthermore, the gene ontology (GO) ‘Positive Regulation of Immune System Process’ was downregulated in UnaG<sup>+</sup> GBM cells; conversely, the GO ‘Negative Regulation of Immune System Process’ was predominantly upregulated in UnaG<sup>+</sup> tumor cells (Table S3). In aggregate, transcriptomic data implicated engagement of immune signaling by UnaG<sup>+</sup> GBM cells favoring immunosuppression.

We next compared our in vivo GBM HIF<sup>ON</sup> gene signature (top 200 upregulated DEGs in UnaG<sup>+</sup> GBM cells) with the “Hallmark Hypoxia” gene set from the MSigDB database (200 genes compiled from multiple hypoxia studies, including many in vitro studies)<sup>41</sup>. This revealed 58 overlapping genes (related to glycolysis, Robo4-VEGF signaling, oxidative stress), but also 142 unique genes captured by the HRE-UnaG reporter concerning cholesterol metabolism, actin cytoskeleton, peroxisome, PPAR (regulator of lipid metabolism and inflammation), and notably chemokine signaling (Figure S3A; Table S4), confirming the distinct characteristics of the GBM HIF<sup>ON</sup> gene signature in vivo.

### UnaG<sup>+</sup> gene signature is more represented in recurrent GBM and predicts worse outcome

To assess the prognostic value of our in vivo UnaG<sup>+</sup> gene signature, we mined the TCGA human GBM data resource. We found that GBM patients in the high expressor group for UnaG<sup>+</sup> signature had shorter survival than the low expressor group, and this applied to all three GBM transcriptional subtypes (Figures 5E and S3B–C, Table S5A). Consistently, the MES subtype (more malignant than PN or CL) displayed the highest enrichment for UnaG<sup>+</sup> gene signature (Figure S3D). Moreover, the UnaG<sup>+</sup> gene signature was also more represented in recurrent than primary GBMs, underscoring the importance of a HIF<sup>ON</sup> gene program in GBM relapse (Figure 5E).

As a further validation of the clinical relevance of our UnaG<sup>+</sup> gene signature, we analyzed the human Ivy Glioblastoma Atlas Project (Ivy GAP) database, which contains gene expression profiles from distinct anatomical zones, including perinecrotic zone (Pz), pseudopalisading cells (Pc), cellular tumor, leading edge, and microvascular proliferation area<sup>42</sup>. Aligned with above findings, Ivy GAP analysis revealed that the UnaG<sup>+</sup> signature was enriched in the Pz and Pc zones (Figure 5F; Table S5B). A survey of Ivy GAP mRNA in situ hybridization data showed higher transcription of top UnaG<sup>+</sup> DEGs in the Pz of human GBM in pseudopalisading patterns (Figure S3E).

UnaG<sup>+</sup> cells were not uniform, as a second round of clustering revealed 4 subpopulations, each with distinct functional specializations, with subcluster (sc)-a concerning cell cycle regulation, apoptotic signaling, and neural crest differentiation, sc-b angiogenesis, sc-c unfolded protein response (UPR) and focal-adhesion, and sc-d IFN signaling (Figures S3F–S3G). Resonating with immune signaling by UnaG<sup>+</sup> cells, various UnaG<sup>+</sup> subclusters were also enriched for immune pathways, e.g., cytoplasmic retention of NF- $\kappa$ B for sc-a,

macrophage chemotaxis for sc-b, and type I and II IFN signaling for sc-d. Of note, NF- $\kappa$ B is a transcription factor controlling numerous pro-inflammatory cytokines<sup>43</sup>; thus cytoplasmic retention of NF- $\kappa$ B signified immune repression<sup>44</sup>, again linking GBM hypoxia and immunosuppression. Comparative IPA similarly revealed that sc-b *UnaG*<sup>+</sup> cells featured IL6, VEGF and CXCR4 signaling, while sc-d featured IFN, neuroinflammation, and necroptosis pathways (Figure S3H). Consistently, IL1B, IFN, and interferon regulator factors (IRFs) were predicted as upstream regulators for sc-b and sc-d gene programs (Figure S3I).

### Hypoxic TAMs express immunotolerance markers

We further examined our scRNA-seq data of immune cells, which comprised two main macrophage clusters, one microglia cluster, a sizable population of T cells, followed by dendritic cells, mast cells, and B cells (Figure 5G). Weighted Gene Co-expression Network Analysis (WGCNA) revealed 10 major co-expressed gene modules in the immune cells, with the one (denoted as “red”) enriched for hypoxia signaling and many immune pathways, and it was predominantly expressed in a subpopulation of microglia and macrophages, with a small representation in dendritic cells and T cells (Figures 5H–5I).

We next focused on TAMs (microglia and macrophages), where WGCNA similarly revealed a distinct co-expressed gene module (“yellow”) enriched for hypoxia signaling and immune pathways, e.g., IL1 signal transduction, with top co-expressed genes including *Iil1b*, *Ccr12*, and *Cxcr4* (Figures 5J and S4A–S4B). We validated in two human GBM scRNA-seq datasets that the “yellow” hypoxic TAM gene module was specifically represented in a subpopulation of tumor-associated macrophages, granulocytes, and dendritic cells (Figures 5K and S4C).

We also compared TAMs to homeostatic microglia in normal brain<sup>45</sup>. The DEGs in TAMs featured type II IFN signaling and immune cell chemotaxis (Figures S4D–S4E). Thus, unbiased single cell transcriptomic analysis revealed the presence of a subpopulation of immune cells displaying hypoxia gene signatures.

### Hypoxic GBM niches drive sequestration and immunosuppression of TAMs and cytotoxic T cells

To further understand TAM diversity, we conducted unsupervised clustering, which identified eight TAM subclusters (sc) in GL261, each with distinct functional specifications, e.g., proinflammatory response (sc-1, -2), proliferation (sc-5, -8), metabolic pathways (sc-5), T cell activation (sc-6), angiogenesis (sc-3, -7), while microglia (sc-4) formed a cluster distinct from macrophages (Figures 6A and S4F–S4G; Table S6A). We also surveyed macrophage subclusters for perivascular macrophages, a subpopulation characterized by the markers *Lyve1* and *Cd163*<sup>46</sup>, but did not find overt expression among TAMs.

Notably, gene signatures of sc-3 macrophages featured hypoxia pathways and immunotolerance/anti-inflammatory signaling such as IL10, IL4 (Figure S4G). Indeed, sc-3 TAMs displayed enrichment for the “Hallmark Hypoxia” gene set (Figure S4H) and they highly expressed hypoxia marker genes *Vegfa* and *Slc2a1*, phagocytic marker *Cd68*, and immunotolerance genes *Mrc1* (CD206) and *Arg 1* (Arginase-1), while *Aif1* (encoding IBA1) was ubiquitously expressed in TAM subclusters (Figure 6B). A pseudotime analysis



implicated a differentiation path from *Ccr2*<sup>+</sup> monocytes (sc-2) to sc-3 TAMs (Figure S4I). We further compared the transcriptomes of sc-3 TAMs with the rest of TAMs, which revealed *Ccl8* and immunotolerance markers *Mrc1* and *Arg1* as among the top DEGs in hypoxic TAMs (Figure 6C; Table S6B).

Both IPA and GSEA further confirmed that sc-3 macrophages were positively enriched for HIF1 $\alpha$  signaling and immunotolerance/anti-inflammatory pathways (e.g., IL10, IL4, PD-1/PD-L1), but negatively enriched for inflammatory pathways (e.g., IFN $\alpha$  and IFN $\gamma$  response, Macrophage Classical Signaling Pathway, and IL2 signaling and Production) (Figures S4J–S4K). Predicted upstream regulators for sc-3 macrophages included MIF, IL1B, IL4, IL10, as well as TGFB and PDCD1 (immune-inhibitory receptor PD-1)<sup>47</sup> (Figure S4L).

To complement the transcriptomic data revealing a distinct hypoxic subpopulation of TAMs (sc-3), we performed co-IF for spatial information, which revealed that entrapped TAMs (CD68<sup>+</sup> or CD206<sup>+</sup>) were co-labeled by GLUT1 or Pimo, respectively (Figures 6D–6E). The entrapped TAMs also expressed ARG1 and were surrounded by UnaG<sup>+</sup> GBM cells in pseudopalisading patterns (Figure 6F). Similar findings were also observed in RCAS and CT2A GBM models (see Figure S1). These data converged on a distinct hypoxic and immunotolerant TAM subpopulation that was sequestered by UnaG<sup>+</sup> pseudopalisades (Figure 6G).

We next analyzed the transcriptomes of T cells (expressing *Cd3e* (CD3<sup>+</sup>)), which could be partitioned into 4 main subclusters: CD8 cytotoxic T lymphocytes (CTLs), Tregs, natural killer (NK) cells, and CD4 T helper cells (Figures S5A–S5C). CD8<sup>+</sup> CTLs contained three subclusters: CTL-a Effector T cells (46%), CTL-b Tissue-resident Effector Memory T cells (30%), and CTL-c Naive T cells (24%) (Figures S5D–S5E; Table S6C). Notably, CTL-a cells featured Hypoxia and Exhausted T cell gene signatures and expressed T cell exhaustion marker *Havcr2* (Figures S5F–S5G), consistent with earlier findings that CTLs infiltrating GBM become mostly exhausted<sup>48,49</sup>. Concordantly, CTL-a marker genes also showed negative enrichment for Inflammatory Response and IFN Signaling, but positive enrichment for immune checkpoint blockade (PD-1L expression and PD-1 checkpoint pathway) (Figures S5H–S5I).

Additional IF staining demonstrated sequestration of CD8a<sup>+</sup> CTLs in UnaG<sup>+</sup> zones, whereas Tregs (FOXP3<sup>+</sup>) largely congregated in UnaG<sup>-</sup> areas (Figure 6H). This also largely held true for RCAS and CT2A GBMs (Figures S5J–S5K). Hence, transcriptomic and histological studies indicated that a subpopulation of T cells (showing signs of hypoxia and immune exhaustion) was entrapped in pseudopalisading hypoxic zones, further linking tumor hypoxia to immunosuppression.

We conducted 5-color multiplex imaging, which confirmed congregation of CD68<sup>+</sup> TAMs and CD8a<sup>+</sup> CTLs inside of UnaG<sup>+</sup> pseudopalisades in vascular-poor areas of GL261 (Figures 6I and S5L). We also conducted co-IF on fresh frozen human GBM biopsies, which similarly showed co-aggregation of CD11b<sup>+</sup> TAMs and CD8a<sup>+</sup> CTLs in hypoxic zones, whereas FOXP3<sup>+</sup> Tregs accumulated in non-hypoxia areas (Figures 6J–6K; Table S1B).

## Hypoxic GBM cells and immune cells display distinct ligand-receptor signaling communication

We next conducted CellPhoneDB<sup>50</sup> analyses, which revealed a rich repertoire of distinct ligand-receptor signaling between various cell populations in GL261 GBM (Figures S6A–S6F). Specifically, comparison of the communication between hypoxic or non-hypoxic GBM cells and hypoxic TAMs revealed that the hypoxic pairs (i.e., UnaG<sup>+</sup> GBM cells ↔ sc-3 TAMs) mainly communicated regarding phagocytosis of apoptotic cells (LGALS3–MERTK, C3–Integrin  $\alpha$ M $\beta$ 2, ICAM1–Integrin  $\alpha$ X $\beta$ 2), angiogenesis (VEGFA–FLT1, C3–C3AR1), as well as immune suppression and inhibition of TNF signaling (TNFRSF1B–GRN) (Figure S6A). In addition, communication of non-hypoxic GBM cells and hypoxic TAMs included SPP1–CD44 and SPP1–PTGER4 signaling, which mediates recruitment and co-stimulation of immune cells (Figure S6A).

Likewise, the hypoxic GBM cells ↔ non-hypoxic TAMs communication (presumably before becoming entrapped in UnaG<sup>+</sup> pseudopalisades) also mainly concerned inhibition of TNF signaling (TNFRSF1B–GRN) and immune suppression (AXL–GAS6, C3–C3AR1), in addition to phagocytosis and macrophage migration using ICAM1-integrin ligand-receptor pair (Figure S6B).

The communication among tumor cells, e.g., hypoxic GBM cells ↔ non-hypoxic GBM cells mainly concerned angiogenesis, cholesterol metabolism, proliferation, and invasion; whereas the communication of non-hypoxic GBM cells ↔ non-hypoxic GBM cells included adhesion, stemness, and EMT (Figure S6C).

The communication of hypoxic GBM cells ↔ T cells featured T cell recruitment using ICAM1 and COL6A2 as ligands, whereas non-hypoxic GBM cells ↔ T cells communication utilized SPP1 and CXCL10 as ligands that regulate T cell activity (Figure S6D).

The communication between immune cells, e.g., hypoxic TAMs ↔ T cells featured T cell recruitment (FN1–integrin  $\alpha$ 4 $\beta$ 1, FN1–integrin  $\alpha$ 4 $\beta$ 7, CXCL10–CXCR3, CXCL10–DPP4) and immune co-stimulation (TNFSF9–TNFRSF9), whereas the communication of non-hypoxic TAMs ↔ T cells featured control of T cell activity or T cell recruitment (Figure S6E).

Next, we compared the signaling of hypoxic GBM cells with different T cell subpopulations. The communication of hypoxic GBM cells ↔ CTLs mainly concerned migration and adhesion of CTLs (e.g., Collagens–Integrin  $\alpha$ 1 $\beta$ 1 complex), while hypoxic GBM cells ↔ Tregs interactions concerned homing and activation of Tregs and promotion of Treg function (Figure S6F).

We further examined recent human GBM spatial transcriptomics data<sup>51</sup> (Table S1C), focusing on localization of gene signatures and ligand-receptor pairs in hypoxic zones. We validated spatial patterning of macrophages and T cells in hypoxic areas of human GBM (Figure S7A, Data S1). Additionally, we found that CD68<sup>+</sup> spots and CD8A<sup>+</sup> spots in hypoxic zones displayed hypoxia/immunotolerance gene signatures (Figures S7A–S7B,

Data S1). We also confirmed co-localization of tissue spots expressing ligand-receptor pairs (e.g., FN1-Integrin  $\alpha$ V $\beta$ 1, CCL8-CCR1/CCR5 and IL1B-IL1R1) in hypoxic zones and in immune spots expressing CD68 or various T cell markers (Figure S7C). This also applied to signaling between hypoxic GBM cells  $\leftrightarrow$  hypoxic macrophages (e.g., MIF-CD74, LGALS3-MERTK) (Data S1), or between hypoxic GBM cells  $\leftrightarrow$  T cells (Data S1).

### Progressive spatial confinement of TAMs in hypoxic zones involves CCL8 and IL-1 $\beta$

Lastly, we explored the signaling mechanisms underlying TAM trafficking and sequestration in pseudopalisading areas and co-evolution of hypoxic zones. We focused on cytokines CCL8 and IL-1 $\beta$ , as *Ccl8* was identified as a top upregulated DEG in the hypoxic TAMs (sc-3) (see Figure 6C), while IL-1 $\beta$ , a major cytokine of inflammatory responses and cytotoxicity<sup>52</sup>, was one of the top co-expressed genes in the “yellow” hypoxic TAM gene module and also predicted to be an upstream regulator of both sc-3 (hypoxic) macrophages and UnaG<sup>+</sup> tumor cells. Indeed, scRNA-seq demonstrated a specific expression of *Ccl8* and *Il1b* in TAMs, but not tumor cells (Figure 7A), with *Ccl8* highly expressed in hypoxic TAMs (sc-3), while *Il1b* appeared more ubiquitously expressed in all TAMs. CCL8 receptors *Ccr1* and *Ccr5* were also highly expressed in TAMs (Figure 7A).

We first tested whether hypoxic GBM cells send cues to TAMs to induce *Ccl8* and *Il1b* expression. To this end, we exposed primary bone marrow-derived macrophages (BMDMs) to conditioned media (CM) from GL261 GBM cells, which led to a marked upregulation of *Ccl8* and *Il1b*, while CM from hypoxic GL261 cells exerted an even stronger effect (Figure 7B). This also held true for *Cd68* and *Arg1* (Figure 7B). As IL-1 $\beta$  is secreted after proteolytic cleavage of pro-IL-1 $\beta$ <sup>22</sup>, ELISA confirmed that CM from hypoxic GL261 cells induced IL-1 $\beta$  secretion from BMDMs (Figure 7C).

To assess the functional significance of *Ccl8* and *Il1b* induction in hypoxic niches for TAM patterning, we transplanted GL261-HRE-UnaG into *Ccl8/12* or *Il1b* knockout (KO) mice<sup>22,53</sup>. Of note, the *Ccl8/12* KO affects both *Ccl8* and *Ccl12* due to their close genomic proximity; however, *Ccl12* was not specifically expressed in hypoxic TAMs (Figure 7A, Data S1), and it is absent from human genome, implying a lesser role for hypoxia-regulated TAM patterning. We found that while UnaG<sup>+</sup> GBM cells were abundantly detected in both control and *Ccl8/12* or *Il1b* KO hosts, the hypoxic zones outlined by UnaG<sup>+</sup> pseudopalisades were smaller in the KO hosts, corresponding to the less developed spatial patterning of CD68<sup>+</sup> or CD206<sup>+</sup> TAMs (Figures 7D–7E). Moreover, CD8a<sup>+</sup> CTLs accumulated mostly in non-hypoxic areas in both *Ccl8/12* KO or *Il1b* KO hosts, in contrast to WT hosts where they congregated more in UnaG<sup>+</sup> hypoxic zones (Figure 7F).

To further corroborate these findings, we also examined the effect of *Ccl8/12* or *Il1b* ablation in RCAS GBM<sup>22</sup>. One month after the induction of GBM by RCAS-PDGFB/sh *Tip53* virus, we examined the development of hypoxic zones (Figure 7G). Similar to the GL261 model, the RCAS GBMs established in *Ccl8/12* KO or *Il1b* KO mice harbored smaller hypoxic zones (outlined by GLUT1<sup>+</sup> cells) and less developed pseudopalisades than controls (Figures 7G–7H). Of note, in the RCAS GBM model, *Ccl8* or *Il1b* were absent from both tumor and non-tumor cells, whereas in the GL261 model, gene deletions only

occurred in stromal cells, which may account for the more pronounced phenotype of spatial perturbation of TAMs and hypoxic zones in the RCAS GBM model.

Echoing the human GBM spatial transcriptomics data shown in Fig. S7D–S7F, re-examination of the human GBM Ivy GAP database confirmed high expression of *CCL8*, *IL1B*, *CD68*, and *MRC1* in hypoxic areas (Pz), while *MIF* and *LGALS3* (two top DEGs in UnaG<sup>+</sup> GBM cells) were highly expressed by pseudopalisading cells (Pc) (Figure 7I). In addition, TCGA data showed that these hypoxia-associated genes and niche factors as well as CCL8 receptors *CCR1* and *CCR5* are expressed at higher levels in GBM of MES subtype and largely predict poor outcome (Data S1). In aggregate, our data supported a mutual interaction – hypoxic GBM cells release cues to induce CCL8 and IL-1 $\beta$  in TAMs, which in turn promote trafficking/sequestration of TAMs and CTLs in hypoxic zones and the maturation of pseudopalisades (Figure 7J).

## DISCUSSION

Our study highlighted hypoxic zones as a major driver of TAM patterning and immunosuppression during GBM progression. We also unveiled a reciprocal influence between host immune response and tumor hypoxia, with adaptive immunity exacerbating vascular abnormalities and thus tumor hypoxia, whereas hypoxic niches attracted and sequestered TAMs, leading to immunosuppression.

Even though GBM is well known for immunosuppression and tumor hypoxia predicts poor prognosis<sup>54</sup>, the underlying mechanisms linking the two are unclear. Our studies with fully immunocompetent GBM models revealed temporospatial patterning of TAMs coinciding with vascular alterations and emergence of hypoxic niches. We showed that in the GBM interior, majority of TAMs were blood-borne MDMs, whereas microglia largely resided in GBM periphery. Notably, at early stages, MDM aggregated around blood vessels that were dense and regular; later, as vasculature became sparse, tortuous, and engorged, TAMs shifted from perivascular regions to poorly vascularized areas. Our scRNA-seq and IF analyses converged on the presence of a subpopulation of TAMs and CTLs that were hypoxic and immunosuppressed. Hence, two potential mechanisms may account for hypoxia-induced immunosuppression: i) hypoxic zones attract and sequester immune cells, and ii) entrapped immune cells experience hypoxia and become immunosuppressed. The development of pseudopalisading structures in GBM facilitates inflammatory containment, by confining cytotoxic immune cells and necrotic tumor cells (which are immunogenic) inside hypoxic cores and by limiting communication of antigen-presenting cells to effector immune cells.

It is assumed that tumor hypoxia arises from rapid tumor expansion outstripping blood supply; in contrast, our data unveiled adaptive immunity as a driving force of vascular aberrancy and thereby tumor hypoxia. In GBM established in immunocompetent hosts, while the initial tumor vasculatures appeared regular and dense, they became progressively engorged, tortuous, and sparse. In contrast, in SCID hosts lacking functional T and B cells, although GBM tumors reached advanced sizes, tumor vasculatures remained regular and dense, with only scattered hypoxic microregions that never transformed into

pseudopalisades. Hence, immunity-driven vascular aberrancy is a determining force in shaping tumor hypoxia and TAM patterning, leading to immunosuppression.

The distinct in vivo HIF<sup>ON</sup> GBM gene signature captured by the HRE-UnaG reporter and scRNA-seq indicated that hypoxic GBM cells were not only engaged in metabolic adaptation, stress response, but also immune signaling. In addition, the UnaG<sup>+</sup> GBM gene signature indicated quiescence and a mesenchymal shift, both linked to malignant potency<sup>30,55</sup>; it is also more represented in recurrent GBM, in MES GBM subtype, and prognostic for poor survival for GBM patients. scRNA-seq analyses also revealed distinct ligand-receptor communications between tumor cells and immune cells in hypoxic niches, featuring not only angiogenesis, phagocytosis, but also immune cell recruitment, immune checkpoints, and immunosuppression.

The clinical relevance of our study is further supported by the observation of TAM spatial organization in patient GBM samples, correlated with hypoxic burden, glioma grade and MES subtype. Both mouse and human GBM transcriptomic analyses identified a co-expressed gene module in TAMs enriched in hypoxia and immune pathways, including IL1. Moreover, hypoxic niche genes associated with hypoxic GBM cells (*MIF*, *LGALS3*) or hypoxic TAMs (*CCL8*, *IL1B*, *CD68*, *MRC1*) were expressed higher in perinecrotic zones or pseudopalisading cells of GBM patients, particularly for the MES subtype that is linked to elevated malignancy and high immune response<sup>24</sup>. Our results thus substantiated the recent report of tumor and immune cell interactions driving transition to MES-like states in GBM patients<sup>56</sup>.

From a therapeutic point of view, targeting the hypoxic niche may synergize with conventional chemoradiation treatment, not only by reducing the hypoxic tumor population (which is therapy resistant, as chemodrugs target mainly proliferative cells and irradiation requires oxygenation to be effective), but also by attenuating immunosuppression. Current clinical trials with Evo for recurrent GBM have so far yielded only limited positive results<sup>57</sup>, thus combinatorial strategies may be better equipped to bring out therapeutic benefits of perturbing hypoxic niches in GBM. Indeed, we found in GL261 model that combining evofosfamide (Evo) and irradiation eradicated hypoxic niches, abolished TAM sequestration, and achieved better tumor control. Attenuating CCL8, IL1B, or MIF signaling could be another promising strategies, and neutralizing antibodies are being tested for autoimmune disorders and solid cancers (e.g., anti-CCL8<sup>58–60</sup>; anti-IL1B: Gevokizumab<sup>61</sup>, Canakinumab<sup>62</sup>; anti-MIF: Imalumab<sup>63</sup>, 4-iodo-6-phenylpyrimidine<sup>64</sup>, Milatuzumab<sup>65</sup>). Our results also raised the awareness that while boosting anti-cancer immunity is desirable, it may lead to a cascade of interconnected events – cell toxicity, vascular aberrancy, higher hypoxic burden, and immunosuppression –, thus dampening the efficacy of immunotherapy.

In summary, the mutual communication between tumor cells and immune cells in the hypoxic niche plays a determining role in sculpting the immune landscape, which may limit inflammatory spread but also induce a tolerogenic/immunosuppressive microenvironment. The understanding of the reciprocal influence of immune response and tumor hypoxia will have important clinical ramifications for prognosis and advancing immunotherapy for GBM patients.

## Limitations of the study

Our study leveraged 10X Visium transcriptomic data to validate cell type specific interactions of immune cells at hypoxic niches in human GBM, with the caveat that the transcriptomic data was not on single cell level (Visium spots can comprise about 10 cells). Future investigations with single-cell resolution will be needed to further dissect cell-type specific signaling at the hypoxic niche.

Our comparison of immunodeficient SCID vs. immunocompetent WT hosts (receiving identical GL261 GBM transplants) highlighted phenotypic differences of stromal players in shaping tumor hypoxia and TAM patterning. This sets the stage for future studies to address outstanding questions: what would be the phenotypes after B and/or T cell depletion, which subpopulation of T and/or B cells is mainly responsible, are MDMs differentially primed in B6 WT vs. B6 SCID upon entry into the brain and within GBM? Alternative hypotheses (e.g., neutrophil infiltration, pericyte activation) also await further testing. Of note, GL261 is a relatively immunogenic GBM model; it is thus worthwhile to expand investigations in other less immunogenic GBM models.

Our study has not fully revealed the regulatory mechanisms of *Ccl8* and *Illb* induction in hypoxic TAMs, which occurs most likely as result of reciprocal interactions with hypoxic tumor cells. Several factors such as IL1B, IL4, IL6, IL10, MIF, TGF $\beta$ , and VEGF were predicted by IPA upstream regulator analysis, and these factors could shape the transcriptional responses of TAMs or neighboring GBM cells in hypoxic niches. Indeed, MIF and VEGF were top DEGs in UnaG<sup>+</sup> tumor cells, thus likely to be present in conditioned media of hypoxic GL261 cells. Functional analyses and time course studies will be needed to reveal further details of these interactions. Similar scenarios of communication have been described for the cancer stem cell (CSC) population of GBM and infiltrating immune cells<sup>66</sup>. Phenotypic alignment of hypoxic GBM cells and CSCs awaits future studies.

## STAR METHODS

### RESOURCE AVAILABILITY

**Lead contact**—Further information and requests for resources and reagents should be directed to and will be fulfilled by the lead contact Hongyan Zou (hongyan.zou@mssm.edu).

**Materials availability**—Plasmids generated in this study have been deposited at Addgene or are available upon request from the lead contact.

### Data and code availability

- scRNA-seq data has been deposited in NCBI Gene Expression Omnibus database and is publicly available from the date of publication. Accession number is listed in the Key Resources Table.
- This paper does not report original code.



- Any additional information required to reanalyze the data reported in this paper is available from the lead contact upon request.

## EXPERIMENTAL MODEL AND STUDY PARTICIPANT DETAILS

**Mice**—C57BL/6J wild-type mice and C57BL/6J-SCID mice were obtained from The Jackson Laboratory. ICR-SCID mice were purchased from Taconic Biosciences. *Ccl8/12* KO mice<sup>53</sup> were gifted by Dr. Sabina Islam and *Il1b* KO mice<sup>67</sup> were gifted by Dr. Dmitry Shayakhmetov, and were both bred in our colony on C57BL/6J genetic background. Mice of both sexes in the age range of 8–16 weeks were used for experiments. All animals were housed in a climate-controlled, pathogen-free facility with access to food and water ad libitum under a 12-hour light/dark cycle. All animal procedures were conducted in accordance with protocols approved by the Institutional Animal Care and Use Committee (IACUC) of Icahn School of Medicine at Mount Sinai.

**GBM cell lines**—The murine high-grade glioma cell line GL261 (*Kras*<sup>G12T</sup>, *Trp53*<sup>G153C</sup>, *Pten*<sup>-/-</sup>, *c-myc* and *Egfr* amplification)<sup>68–70</sup> was obtained from the repository of the National Cancer Institute. CT2A cells<sup>23</sup> were provided by Dr. Roger Abounader (University of Virginia). Glioma cells were cultured in DMEM media with Glutamax (Gibco) supplemented with 10% FBS (Thermo Fisher Scientific) and 1% Penicillin-Streptomycin antibiotics (Gibco). For long term storage, cells were cryopreserved in medium containing 10% DMSO. Cells were passaged after thawing for at least two passages before use in experiments. For in vitro hypoxia studies, GL261 cells were seeded into 6 well plates and placed for 24 hr in a hypoxia chamber (C-Chamber; Biospherix) set to 1% oxygen. HEK293T cells were obtained from American Type Culture Collection (ATCC).

**RCAS glioma**—A genetically modified mouse model using the RCAS/t-va system was used to generate murine GBM, as previously described<sup>22</sup>. Briefly, DF1 avian fibroblast cells (ATCC) were grown at 39°C, expanded to passage 4 and transfected with RCAS-PDGFB-HA or RCAS-shp53-RFP using a Fugene 6 Transfection kit (Roche, 11814443001). Cells were cultured with DMEM media (Gibco, 11995–065) supplemented with 1% L-glutamine, 1% penicillin/streptomycin, and 10% FBS (ATCC). Transfected DF1 cells were used for injections before reaching passage 25. DF-1 cells ( $4 \times 10^4$ ) were stereotactically delivered with a Hamilton syringe equipped with a 30-gauge needle for tumor generation. The injection site was the frontal striatum with the coordinates AP –1.7 mm and right –0.5 mm from bregma; depth –2.0 mm from dural surface. Mice were continually monitored for signs of tumor burden and were sacrificed upon observation of endpoint symptoms including head tilt, lethargy, seizures, and excessive weight loss.

**Human participants**—All human studies were performed on de-identified archived tissue specimens from GBM patients. A tissue microarray slide with Formalin-Fixed Paraffin-Embedded (FFPE) specimens from 71 glioma patients (collected before commencement of standard of care) was obtained from US Biomax, Inc. The following FFPE specimens of grade 4 gliomas were obtained from Emory University: GBM patient sample S15 35549, from a 57 year old male, diagnosed with recurrent grade 4 glioma; patient had undergone radiation therapy and GBM transcriptional subtype was determined as Proneural upon

Nanostring RNA-seq. GBM patient sample S16 71 was obtained from a 56 year old female, diagnosed with a primary grade 4 glioma; patient had undergone treatment with radiation therapy, temozolomide, lomustine and bevacizumab and GBM subtype was determined as Classical. GBM patient samples S16 18015, S15 20710, S16 18411 and S16 736 were obtained from a 67 year old male, 73 year old male, 70 year old female, and a 56 year old female respectively. GBM subtype was determined as Mesenchymal. Patient S16 18015 had undergone treatment with temozolomide<sup>26</sup>. Fresh frozen GBM patient samples (tissue ID 13629) were obtained at The Mount Sinai Hospital biorepository from a 70 year old male, who was diagnosed with a primary malignant grade 4 glioma.

## METHOD DETAILS

**Generation of lentiviral HIF reporter**—The plasmid dUnaG was obtained from the Kiefer laboratory<sup>17</sup> and used as template to amplify an HRE-dUnaG PCR fragment, which was inserted into the Gateway entry vector pENTR/D-TOPO (Invitrogen) and then transferred by Gateway LR reaction (Invitrogen) into the destination plasmid pLenti X1 Puro DEST (Addgene #17297)<sup>71</sup>. The final pLenti-HRE-dUnaG plasmid (deposited as Addgene #124372) carries an array of five hypoxia-response elements (HRE) and a minimal CMV promoter to drive the expression of UnaG fused to a PEST degron and C-terminal myc tag, and in addition a puromycin resistance gene driven by a constitutive phosphoglycerate kinase (PGK) promoter. Of note, the myc tag was used in some immunofluorescence experiments to stain for UnaG with an anti-myc antibody to extended stability of fluorescence for storage of sections.

Lentiviral particles were produced by transfection of HEK293T cells with the pLenti plasmid, envelope plasmid pMD2.G, and packaging plasmid psPAX2 (Addgene #12259 and #12260; deposited by Didier Trono, EPFL Lausanne). Media supernatants were collected 2–3 days after transfection and viral particles were concentrated by ultracentrifugation.

**Transduction of GBM cells**—GL261 cells were transduced with a mixture of HRE-UnaG lentiviral particles and polybrene (5 mg/ml). Transduced cells were selected with 1 µg/ml puromycin, starting 48 hr after transduction. Early passages of GL261-HRE-UnaG cells were frozen 1 wk after puromycin selection, and subsequent passages were cultured in media with 0.5 µg/ml puromycin to prevent silencing of lentiviral vectors.

**Intracranial transplantation of tumor cells**—Mice were anaesthetized in an induction chamber with a 2.5% isoflurane/oxygen mixture and secured to a stereotaxic apparatus (Stoelting). Anesthesia was maintained with a 1.5% isoflurane/oxygen mixture, which was delivered via a nose-cone. A lubricant ophthalmic ointment (Artificial Tears, Akron) was applied. A cranial hole was drilled through a scalp incision 2.0 mm lateral and 0.5 mm posterior to Bregma. GBM cells ( $10^5$  cells) suspended in 5 µl PBS were then injected through the hole at a depth of 3.2 mm using a 10 µl gas tight syringe (Hamilton) and a Nanomite programmable syringe pump (Harvard Apparatus) with a constant infusion rate of 1 µl/min to prevent backflow. After injection, syringe was incrementally raised using the stereotaxic apparatus over a period of 5 min. Scalp incision was sealed using a tissue adhesive (Vetbond, 3M).

**Immunofluorescence and immunohistochemistry**—Mice carrying intracranial GBM transplants or *de novo* tumors induced by RCAS/t-va system were intracardially perfused with PBS followed by 4% PFA/PBS. Brains were harvested and fixed overnight in 4% PFA/PBS followed by two successive overnight incubations in 12.5% and 25% sucrose/PBS. Brains were then embedded in O.C.T compound (Fisher Scientific), frozen on dry ice. Cryosections of 20  $\mu\text{m}$  thickness were cut using a cryostat (Leica) and collected in PBS and stored as floating sections at 4°C.

For immunofluorescence, floating sections were blocked for 1 hr (blocking buffer: PBS with 5% donkey serum and 0.3% Triton X-100), then incubated overnight with primary antibodies in antibody dilution buffer (PBS with 1% BSA and 0.3% Triton X-100), followed by staining with Alexa-labeled secondary antibodies (Jackson ImmunoResearch) for 2 hr, and counterstaining with DAPI (Invitrogen). Sections were washed in PBS and mounted with Fluoromount G (Southern Biotech).

For immunohistochemistry of microtome sections from patient GBM specimens and from mouse brains carrying RCAS induced tumors, sections from FFPE tissue blocks were processed at the Mount Sinai Pathology core using a Ventana system (Roche).

Antibodies are listed in the Key Resources Table.

**Single-cell RNA sequencing**—Animals were euthanized, brain tissue containing the main tumor bulk was dissected on ice, and a tissue piece of approximately 3 mm edge length was diced with scalpel blades and dissociated into single cell suspension using papain digestion (Miltenyi Neural Tissue Dissociation Kit (P) 130-092-628).

The cell suspension was pelleted and resuspended in 7 ml of HBSS (without Ca/Mg), mixed with 1.2 ml of fetal bovine serum (FBS) and 3.6 ml of 100% Percoll (GE Healthcare). The Percoll cell suspension was overlaid with 1 ml of 10% FBS in DMEM and spun at 800g for 15 min, and pellet was collected in a new 15 ml tube and resuspended in 0.5 ml of FACS buffer ((Hibernate-E low fluorescence (BrainBits) with 0.2% BSA and 20  $\mu\text{g}/\text{ml}$  DNase (Worthington)). Red blood cells (RBCs) were lysed by incubating cells with RBC lysis buffer (BioLegend) for 15 min at room temperature; cells were washed and resuspended in FACS buffer. The final cell suspension was submitted for single cell sequencing with the 10X Genomics system at the Mount Sinai Genomics core facility (using ~10,000 viable cells from the sample).

**Bioinformatic analysis**—Clustering analysis of scRNA-seq data was performed with the Seurat software package on the R platform<sup>72</sup>. We calculated signature score for GBM cell state with the scrabble software package (jlaffy.github.io/scrabble/), using the gene list of the MES2 signature<sup>29</sup>.

Gene set enrichment analysis (GSEA) of gene lists ranked by expression changes was performed with the GSEA platform<sup>39,73</sup>. We used the Enrichr website for the pathway analysis for differentially expressed genes (cut-off:  $P < 0.05$ ; fold-change  $> 2$ -fold)<sup>38</sup>.

The GBM biodiscovery portal (<http://gbm-biodp.nci.nih.gov>; accessed 02/2021) was used to match UnaG<sup>+</sup> gene expression signature with patient survival<sup>74</sup>. cBioPortal (<https://www.cbioportal.org>; accessed 02/2021) was used to match occurrence in recurrent vs. primary GBM (TCGA-GBM Firehose legacy dataset, mRNA expression (mRNA expression z-scores relative to all samples (log RNA Seq V2 RSEM))<sup>75,76</sup>. Pseudotime analysis was performed with Monocle 3 software package on R platform<sup>77</sup>. The Ivy GAP database, containing expression data from 122 micro-dissected anatomical domains of 10 GBM patients, was used for GBM anatomical transcriptional analysis ([glioblastoma.alleninstitute.org](http://glioblastoma.alleninstitute.org))<sup>42</sup>.

Raw fastq files were aligned to mouse genome reference mm10 using Cell Ranger v5.0.0 (10X Genomics). Cell Ranger-filtered count matrix was processed and analyzed using R package Seurat v4.0.5. Normalization was performed using NormalizeData function with normalization.method = 'LogNormalize'. Dimensionality reduction was computed on the top 2,000 variable features using FindVariableFeatures, ScaleData and RunPCA functions. UMAPs were generated using the top 15 PCs. Identification of modules of co-expressed genes was carried out using Weighted Gene Co-expression Network Analysis (WGCNA) using the R package hdWGCNA v0.1.1.9006 (<https://github.com/smorabit/hdWGCNA>). Metacells of 25 cells (k=25, overlap=10) were generated with *MetacellsByGroups* function following by identification of co-expression modules using *ConstructNetwork* function with following parameters: softPower=6, deepSplit=1, mergeCutHeight = 0.25. Only the top 10,000 variable genes were considered. Enrichment analysis on the WGCNA modules was carried out with clusterProfiler v.4.2.0 using the GSEA MSigDB HALLMARK gene set annotation for mouse genes (downloaded at <https://bioinf.wehi.edu.au/MSigDB/> on 09/08/2022). Cell-cell interaction analysis was carried out with CellPhoneDB v4<sup>78</sup>.

A 10X Visium spatial transcriptomic dataset of 17 GBM patient samples<sup>51</sup> was downloaded from Datadryad (<https://datadryad.org/stash/dataset/doi:10.5061/dryad.h70rxwdmj>) and analyzed using the Seurat R package. All GBM patient samples were scored for Hallmark Hypoxia gene signature. Patient samples UKF265, UKF255 and UKF248 were selected for our analyses as they showed the most hypoxic burden of all samples. Spots corresponding to hypoxic zones were selected from UMAPs and presence of immune cells in spatially correlated spots was deduced by analyzing expression of marker genes.

**Pimonidazole staining**—Mice bearing intracranial GL261 tumors were intraperitoneally injected with 60 mg/kg pimonidazole (Hydroxyprobe), which was diluted in 0.9% saline. To stain for pimonidazole labeled cells, brain cryosections were blocked overnight and incubated with mouse Dylight-549 anti-pimonidazole antibody (clone 4.3.11.3; Hydroxyprobe). Sections were mounted with Fluoromount-G (SouthernBiotech) and images were acquired by fluorescence microscopy with a Zeiss Axio microscope.

**Irradiation and evofosfamide treatment**—Mice bearing GBM were randomly divided into four cohorts (Control, XRT only, Evo only, XRT+Evo). Treatments were administered two weeks after intracranial transplantations to allow for tumor establishment. For XRT, mice were irradiated in a X-Rad 320 irradiator (Precision X-Ray), twice every week with a 2.5 Gy dose for two weeks (5 Gy total dose/week). A lead shield was placed over the body

of the mice to only expose heads to radiation. Mice in the Evo cohort were administered with 50 mg/kg i.p. injection of Evo (AdooQ Bioscience) every day for two weeks. Mice in the XRT+Evo treatment cohort were injected daily with Evo (50 mg/kg) for two weeks and were concurrently treated with 2.5 Gy radiation twice every week. Mice in all cohorts were weighed daily and monitored for ambulatory, feeding, and grooming activities, and animals meeting humane endpoints were euthanized.

#### **qRT-PCR analysis of bone marrow derived macrophages treated with tumor conditioned media**

—The isolation of bone marrow-derived macrophages followed previously described protocols<sup>79</sup>. In brief, mice were sacrificed by cervical dislocation and bone marrow was extracted from tibia and femur by flushing out with DMEM media containing 10% FBS with a 25-gauge needle attached to a 10 ml syringe. The cell suspension was passed through a 70  $\mu$ m strainer and centrifuged at 300 g for 5 min at room temperature. The cell pellet was resuspended with DMEM media containing 10% FBS and MCSF (25 ng/ml; Peprotech). The media was changed every two days for 7 days to obtain pure differentiated BMDMs.

To produce conditioned media, 300,000 cells of murine GBM cell lines GL261<sup>70</sup> were plated in 10 cm culture dish in DMEM media containing 10% FBS. After one day, media was changed to fresh media and the cells were incubated for another 2 days. To obtain media supernatant conditioned by hypoxic GBM cells, dishes were placed in a 1% oxygen hypoxic chamber (Biospherix). The conditioned media was collected after 2 days and the supernatant was centrifuged at 300 g for 5 min to remove cell debris.

BMDM cultures were treated with supernatant for 48 hours. For qRT-PCR analysis, RNA of BMDMs was extracted using the RNeasy mini kit (QIAGEN) and cDNA was synthesized using SuperScript III First Strand Synthesis System (Invitrogen). Quantitative PCR was performed using PerfeCTa SYBR Green FastMix Rox (Quanta Biosciences) in the ABI 7900HT qPCR system (Applied Biosystems). Primers are listed in the Key Resources Table. Gapdh was used as the housekeeping gene for normalization.

#### **ELISA of bone marrow derived macrophages treated with tumor conditioned media**

—ELISA was performed using the Mouse IL-1 beta/IL-1F2 DuoSet ELISA kit (R&D Systems DY401-05), using additional reagents from the DuoSet ELISA ancillary reagent kit 2 (R&D Systems DY008). Briefly, a 96-well microplate was coated with IL-1 $\beta$  capture antibody, then 100  $\mu$ l of samples or standards was added to each well, followed by streptavidin-HRP, and color reaction. The plate was then immediately read at 450 nm using a microplate reader. Microsoft Excel and GraphPad Prism 9 software were then used to generate a standard curve to calculate values for samples.

## **QUANTIFICATION AND STATISTICAL ANALYSIS**

**Image quantifications**—Image data were quantified with Fiji Is Just ImageJ (FIJI) package of Image J<sup>80</sup>. To quantify abundance of marker or UnaG reporter expression, in each selection of region of interest (ROI), percentage of ROI area positive for fluorescent or immunosignals was automatically counted after applying a threshold mask followed by morphological segmentation using MorphoLib J Plugin<sup>81</sup>. For vessel density, in each

selected region of interest (ROI), PECAM1<sup>+</sup> vessel sections were manually counted, and numbers were normalized to area size of ROI. To quantify signal abundance per unit area, images were spatially calibrated and total number of signal positive areas were divided by area of ROI. The ‘plot profile’ function of Image J was used to generate profiles of relative immunofluorescence in a chosen ROI (this function sums up the pixel values of vertical lines in a ROI and plots them as profile).

**Statistical analysis**—Statistical analyses were performed using GraphPad Prism 9 software. Bar graphs represent means and error bars represent SEM. One-way ANOVA with Tukey’s post-hoc correction (for three or more experimental groups) and t test were performed to assess if experimental groups were significantly different from each other.  $P < 0.05$  was considered to be statistically significant (\*).  $P < 0.01$ , \*\*;  $P < 0.001$ , \*\*\*.

## Supplementary Material

Refer to Web version on PubMed Central for supplementary material.

## ACKNOWLEDGEMENTS

We thank Friedemann Kiefer (Max-Planck Institute for Molecular Biomedicine, Münster, Germany) for sharing HRE-UnaG plasmids, Kristin Beaumont (Icahn School of Medicine at Mount Sinai) for advising on single-cell RNA sequencing experiments, and Sanjana Shroff (Mount Sinai Genomics Core Facility) for performing quality control and library preparations for single-cell RNA sequencing. We also thank Raymund Yong for providing patient GBM specimens (Mount Sinai Biorepository and Pathology Core) and Ruben Fernandez-Rodriguez (Histology Core Lab) for help with IHC of patient specimens; and Glenn Doherty and Nikolaos Tzavaras (Mount Sinai Microscopy Core Facility) for assisting in imaging. We thank Dalia Halawani and all members of Zou and Friedel laboratories for their valuable suggestions. Graphical abstract was created with [BioRender.com](https://BioRender.com). This work was supported by the National Institutes of Health/National Institute of Neurological Disorders and Stroke grants R01NS107462 (to HZ and RHF), R21NS125700 (to HZ and RHF), R01NS092735 (to RHF), F31NS124259 (to VM), and R01NS100864 (to DH).

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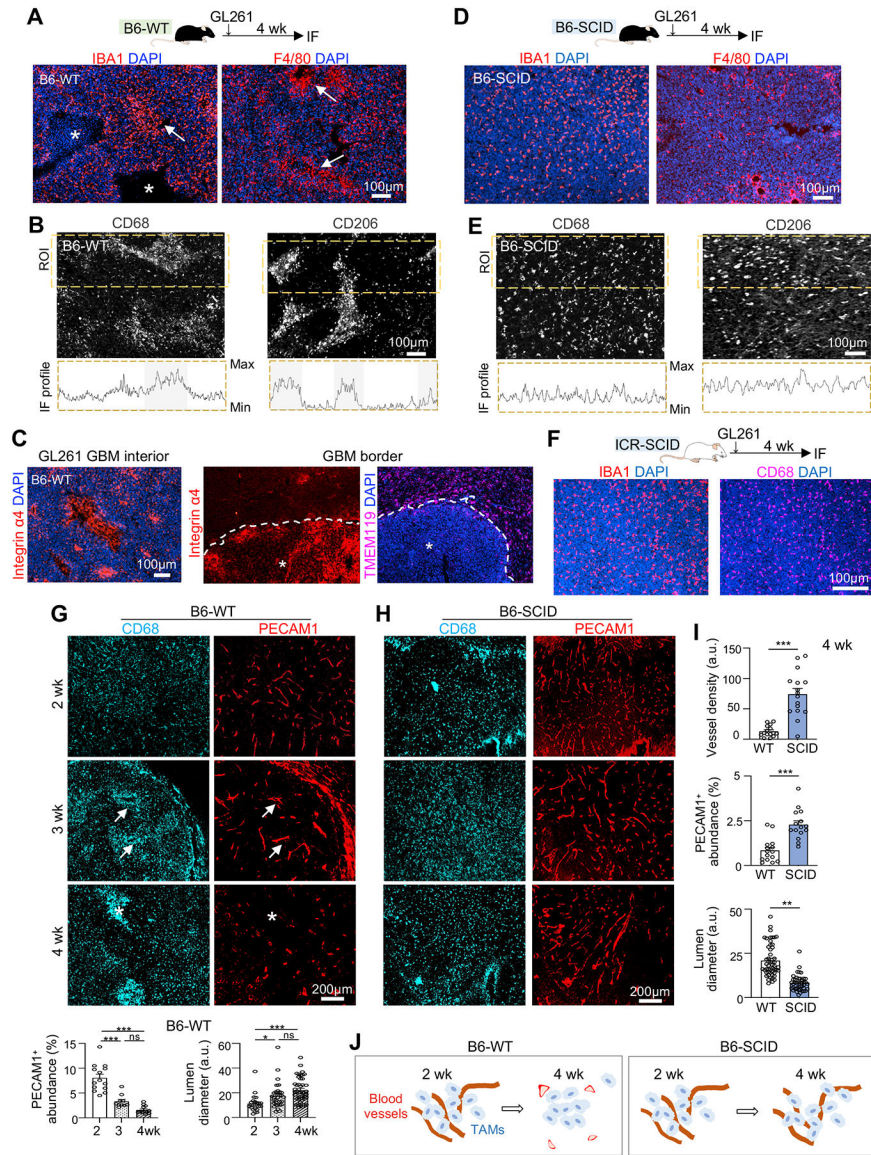
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### Highlights

- Host immune status influences tumor vasculature and hypoxic zone formation in GBM
- Spatial patterning of TAM and CTL parallels hypoxic zone maturation to pseudopalisades
- Sequestered TAM and CTL in hypoxic zones are reprogrammed towards immunosuppression
- TAM/CTL organization involves CCL8 and IL-1B as niche factors in hypoxic zones





**Figure 1. Temporospatial patterning of TAMs parallels vascular changes during GBM progression and is influenced by host immunocompetence status.**

(A) Top, experimental scheme of intracranial transplant of GL261 GBM cells into C57BL/6 wild-type (B6-WT) hosts and IF analysis 4 weeks later. Bottom, representative IF images from  $n=3$  mice show spatial patterning of IBA1<sup>+</sup> and F4/80<sup>+</sup> TAMs. Asterisks, necrotic cores; arrows, TAM aggregates.

(B) IF images and profile plots of IF intensities of CD68 or CD206 within region of interest (ROI, dashed boxes).

(C) IF images of MDM (integrin  $\alpha 4^+$ ) or microglia (TMEM119<sup>+</sup>) in GBM interior (asterisks) or GBM border (dashed line) at 4 weeks post-transplant in B6-WT host.

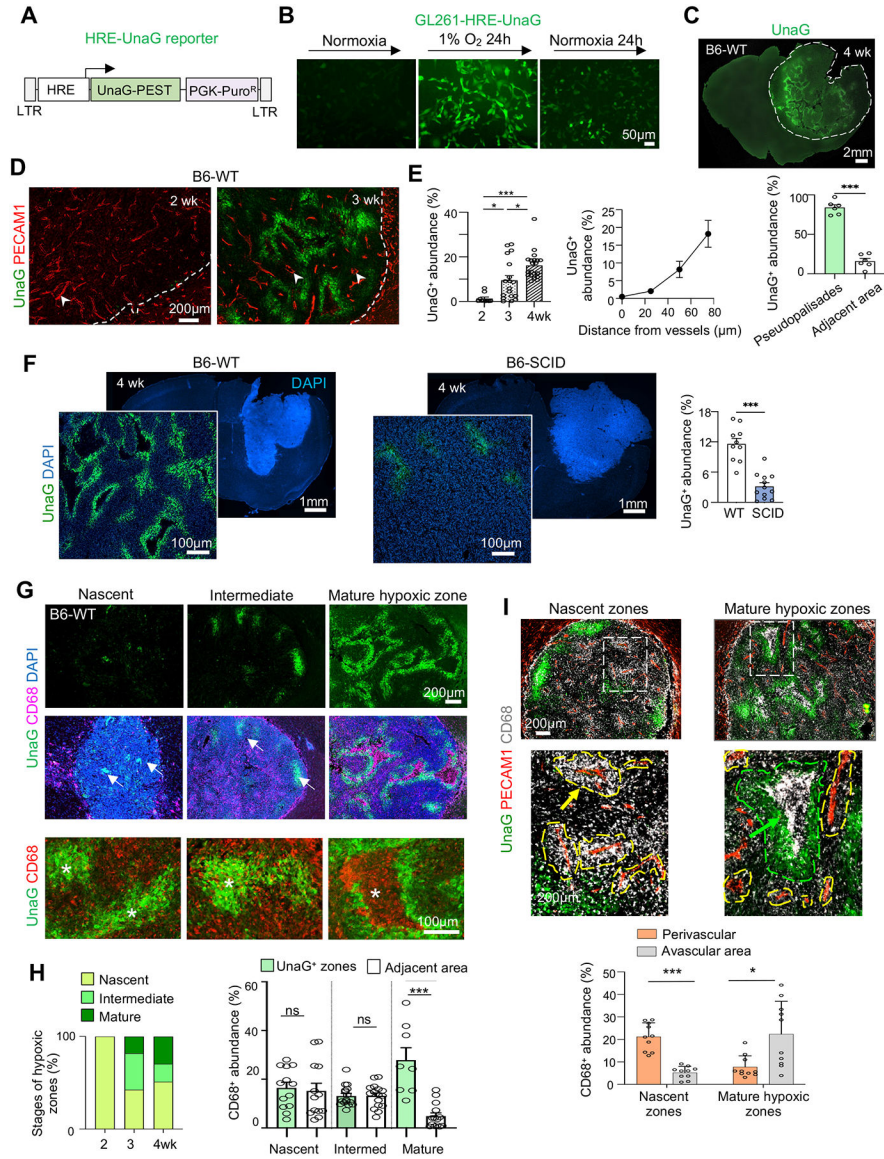
(D) Top, experimental scheme of GL261 transplanted into C57BL/6-SCID (B6-SCID) hosts and IF analysis 4 weeks later. Bottom, representative IF images from  $n=3$  mice show distribution of TAMs (IBA1<sup>+</sup> or F4/80<sup>+</sup>).

**(E)** IF images and profile plots of IF intensities of CD68<sup>+</sup> and CD206<sup>+</sup> TAMs within ROI in B6-SCID host.

**(F)** Representative IF images show distribution of IBA1<sup>+</sup> and CD68<sup>+</sup> TAMs in GL261 established in ICR-SCID host (n=3 mice).

**(G-I)** IF images and quantifications of vascular changes and temporospatial transition of CD68<sup>+</sup> TAMs in distinct zones of GL261 GBM established in B6-WT host (G) or B6-SCID host (H). Quantifications in bottom of (G): PECAM1 abundance, n=10 tumor areas; lumen diameter, n=30 tumor areas, from n=3 mice per timepoint. One-way ANOVA; a.u., arbitrary units. Quantification of vascular comparison (I): n=15 randomly chosen tumor areas from n=5 mice per group; unpaired t-test. \* $P < 0.05$ ; \*\* $P < 0.01$ ; \*\*\* $P < 0.001$ ; ns, not significant.

**(J)** Diagrams depicting TAM spatial patterning in parallel to vascular changes in dependence of host immune status.



**Figure 2. TAM trafficking coincides with the emergence of hypoxic zones and development of pseudopalisades in GBM.**

(A) Diagram of lentiviral HRE-UnaG reporter.

(B) Representative images of UnaG expression in GL261 cells (stably transduced with lenti-HRE-UnaG) when exposed to 1% O<sub>2</sub> or normoxia. n=3 cultures.

(C) Fluorescent image and quantification of UnaG<sup>+</sup> cells in pseudopalisading or adjacent areas of GL261-HRE-UnaG GBM established in B6-WT host at 4 wk post-transplant. n=6 tumor areas from 4 mice.

(D) Representative IF images from n=3 mice show emergence of UnaG<sup>+</sup> tumor cells between 2–3 weeks post-transplant in vascular poor areas. Arrowheads point to tumor vasculatures with engorged lumen.

(E) Left, quantification of UnaG<sup>+</sup> areas during GBM progression. n=10 tumor areas from 3 mice per timepoint. Right, quantification of UnaG abundance in relation to the distance from blood vessels. n=11 tumor fields for each distance.

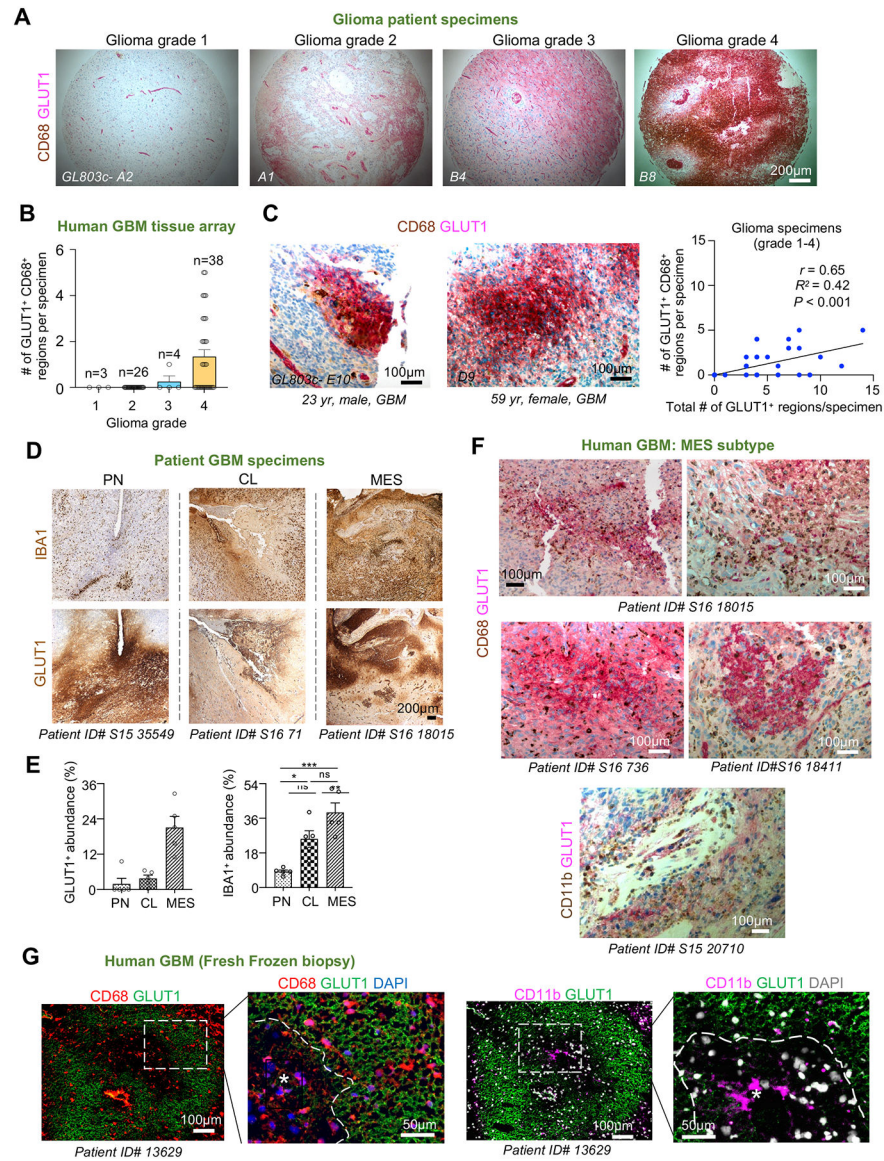
**(F)** Representative IF images from n=3 mice show an overview of GBM burden (DAPI at low magnification) and hypoxic zones (UnaG at high magnification) in B6-SCID vs. B6-WT hosts. Quantification: n= 10 tumor areas from 3 mice per group.

**(G, H)** Top two rows, IF images show transition of hypoxic zones (UnaG<sup>+</sup>) from nascent (arrows) to mature pseudopalisades and corresponding spatial patterns of CD68<sup>+</sup> TAMs during GL261 progression. Bottom row, high magnification IF images show cell-cell sorting of CD68<sup>+</sup> TAMs and UnaG<sup>+</sup> tumor cells in hypoxia areas (asterisks). Quantification: n=10 tumor areas from 3 mice for each group.

**(I)** IF images and quantification show transition of CD68<sup>+</sup> TAM at perivascular location in nascent zones to vascular poor area in mature hypoxic zones of GL261 GBM. Enlarged images of boxed areas are shown below. n= 13 tumor areas from 3 mice per group.

Unpaired t-test (C, F, H), One-way ANOVA (E, I), \* $P < 0.05$ , \*\*\* $P < 0.001$ , ns, not significant. See also Figure S1.



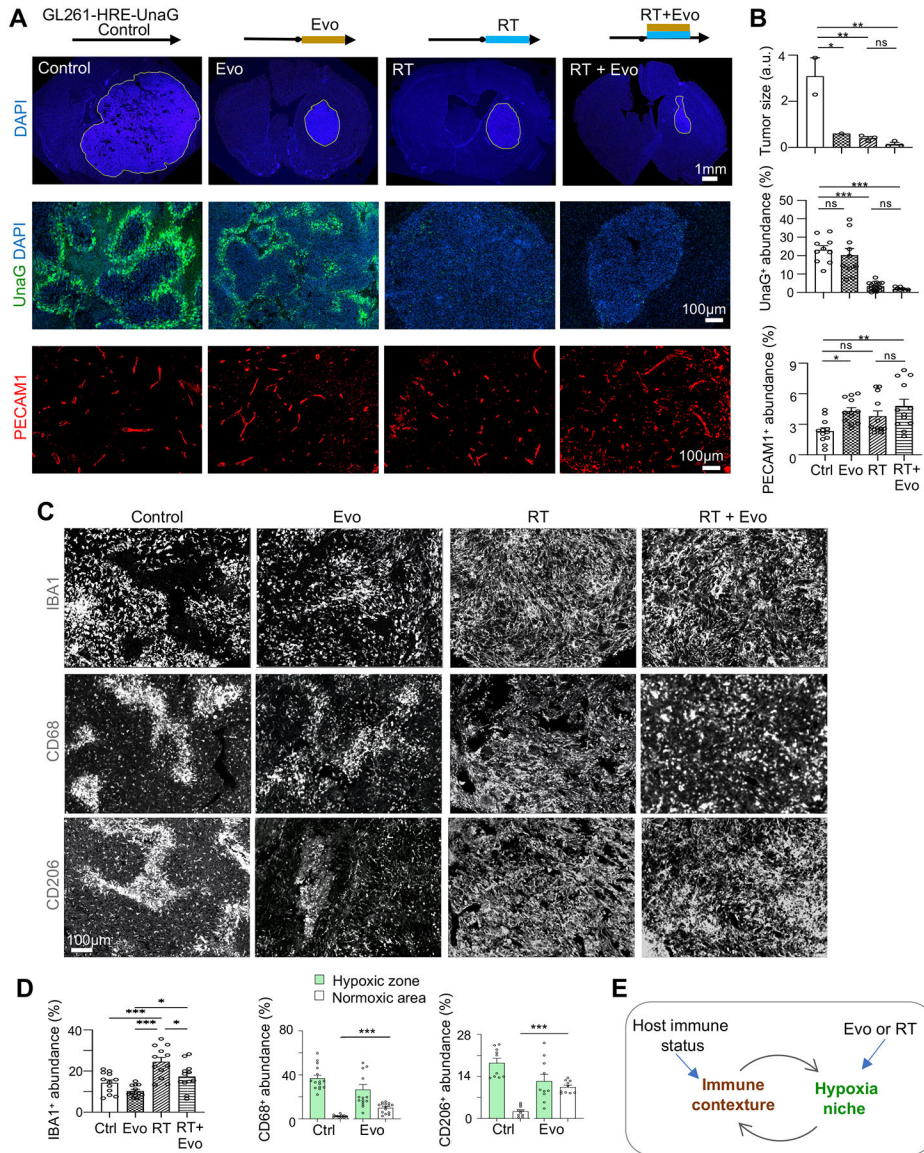


**Figure 3. Spatial patterning of TAMs corresponds to hypoxic zones in GBM patient specimens.** (A) IHC on tissue microarray of glioma biopsy specimens of different grade (n=71 patients, US Biomax, no. GL803c) co-stained for GLUT1 (pink) and CD68 (brown). Hematoxylin for nuclear counterstaining. (B) Quantification of the relative abundance of hypoxic zones containing CD68<sup>+</sup> TAMs in relation to glioma grades (n= 71 patient samples). (C) High magnification IHC images of GBM patient biopsy specimens co-stained for GLUT1 and CD68. Pearson correlation of hypoxic burden (GLUT1<sup>+</sup>) in relation to the abundance of hypoxic zones harboring TAMs (n= 71 patient samples). (D, E) IHC images and quantifications show the abundance of GLUT1<sup>+</sup> and IBA1<sup>+</sup> areas in GBM subtypes. Hematoxylin for nuclear counterstaining. Specimen IDs are denoted below each image. n=5 randomly selected zones for each subtype; one-way ANOVA; \* $P < 0.05$ , \*\* $P < 0.01$ , \*\*\* $P < 0.001$ , ns, not significant.

**(F)** Tissue sections of human GBMs of MES subtype co-stained for GLUT1 and CD68. Hematoxylin for nuclear counterstaining.

**(G)** IF images of sections from fresh frozen human GBM samples show distribution of CD68<sup>+</sup> or CD11b<sup>+</sup> TAMs in relation to hypoxic zones (asterisks) outlined by GLUT1. See also Figure S1.





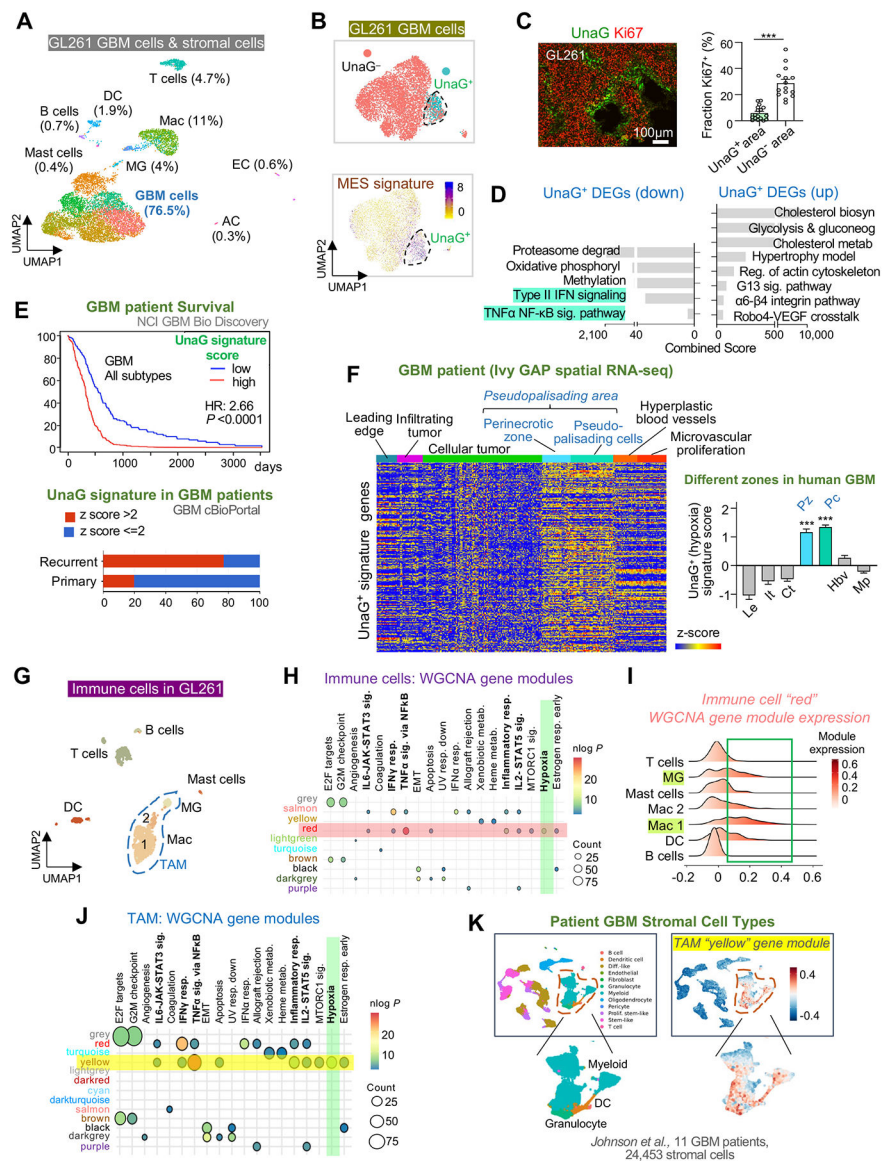
**Figure 4. Targeting hypoxic niches disrupts spatial patterning of TAMs.**

(A, B) Two weeks after transplantation, B6-WT mice bearing GL261 GBM were treated for 2 weeks with evofosfamide (Evo), radiation treatment (RT), or both. IF images (A) and quantifications (B) show tumor area, hypoxic zones (UnaG<sup>+</sup>), and tumor vasculature (PECAM1<sup>+</sup>) after treatment.  $n=3$  mice for tumor size;  $n=10$  for UnaG, and  $n=12$  for PECAM1 abundance in randomly selected tumor areas from 3 mice per cohort.

(C, D) IF images (C) and quantifications (D) show abundance and distribution of TAMs expressing IBA1, CD68, or CD206 after treatments.  $n=10-15$  randomly selected images from 3 mice per treatment condition.

(E) Diagram depicting interaction of immune response and tumor hypoxia.

One-way ANOVA (B, D); \* $P<0.05$ , \*\* $P<0.01$ , \*\*\* $P<0.001$ , ns, not significant.



**Figure 5. Single cell RNA-seq reveals distinct in vivo GBM hypoxia gene signature and the presence of a hypoxic subpopulation of immune cells.**

(A) UMAP plot of cell types identified by scRNA-seq of GL261 tumor in B6-WT host at 4 weeks post-transplant.

(B) UMAP plot of GL261 GBM cells shows UnaG<sup>+</sup> and UnaG<sup>-</sup> cell clusters and expression scores for MES2 gene signature (*Nefel et al., 2019*).

(C) IF image and quantification show fraction of Ki67<sup>+</sup> cells in UnaG<sup>+</sup> and UnaG<sup>-</sup> areas. n=15 tumor areas from 3 mice per group; unpaired t-test; \*\*\**P*<0.001.

(D) ENRICH pathway enrichment analysis of up- and downregulated DEGs in UnaG<sup>+</sup> vs. UnaG<sup>-</sup> GBM cells (WikiPathways 2019 gene sets).

(E) Top, survival curve of human GBM patients stratified into high or low expressors of UnaG<sup>+</sup> GBM gene signature based on TCGA GBM database (NCI BioDiscovery portal). Bottom, representation of UnaG<sup>+</sup> gene signature in primary vs. recurrent human GBM (cBioPortal).

**(F)** Heatmap and bar graph show relative enrichment of UnaG<sup>+</sup> gene signature in different zones of human GBM based on Ivy GBM Atlas Project (Ivy GAP) database. One-way ANOVA; \*\*\* $P < 0.001$ .

**(G)** UMAP of immune cells in GL261 GBM.

**(H)** Transcriptome of immune cells analyzed by weighted gene correlated network analysis (WGCNA). Co-expressed gene modules (rows with color names) were assessed for enrichment of hallmark gene sets (columns). Highlighted row and column denote enrichment of module “red” for “Hypoxia” gene set (green).

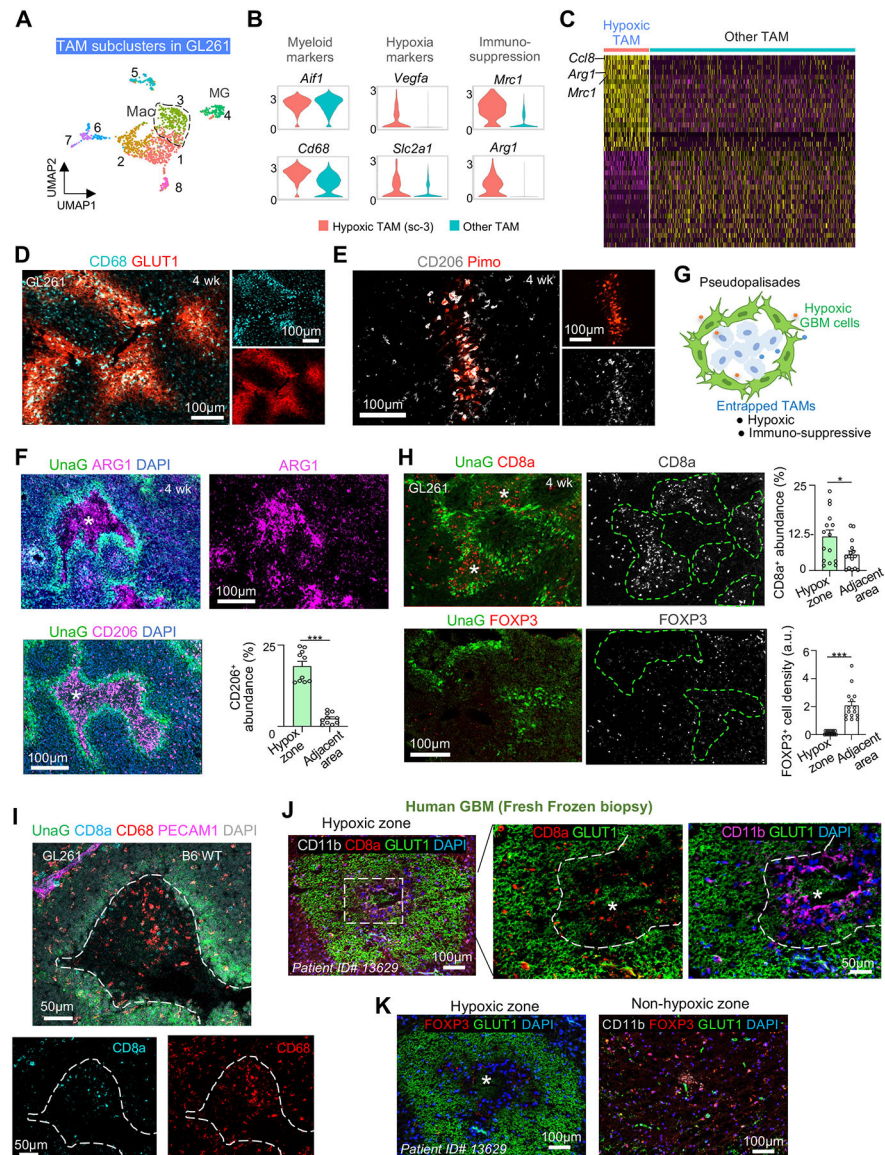
**(I)** Expression scores for WGCNA gene module “red” in different immune cells of GL261 GBM.

**(J)** Transcriptome of TAMs analyzed by WGCNA. Selected co-expressed gene modules (rows) were assessed for enrichment of hallmark gene sets (columns). Highlighted row and column denote enrichment of gene module “yellow” for “Hypoxia” gene set (green).

**(K)** Mapping of hypoxic TAM gene module “yellow” onto human GBM patient scRNA-seq dataset (*Johnson et al., 2021*) shows enrichment scores in myeloid cells, as well as granulocytes and dendritic cells (DC).

See also Figures S2–S4.





**Figure 6. Entrapped TAMs in hypoxic zones express immunosuppressive markers.**

(A) UMAP plot of TAM subclusters in GL261.

(B) Violin plots of marker gene expression in TAM subcluster 3 (hypoxic) vs. other subclusters combined.

(C) Heatmap showing DEGs in hypoxic TAMs, with top upregulated DEGs labeled.

(D, E) Representative IF images from GL261 transplants (n=3) show expression of CD68 or CD206 in relation to hypoxia markers GLUT1 or Pimo.

(F) IF images show expression of immunotolerance markers Arginase-1 (Arg1) and CD206 in sequestered TAMs in hypoxic zones (asterisks). Quantification: n=10 randomly selected tumor areas from 3 mice per condition.

(G) Schematic of TAM patterning in hypoxic zones of GBM.

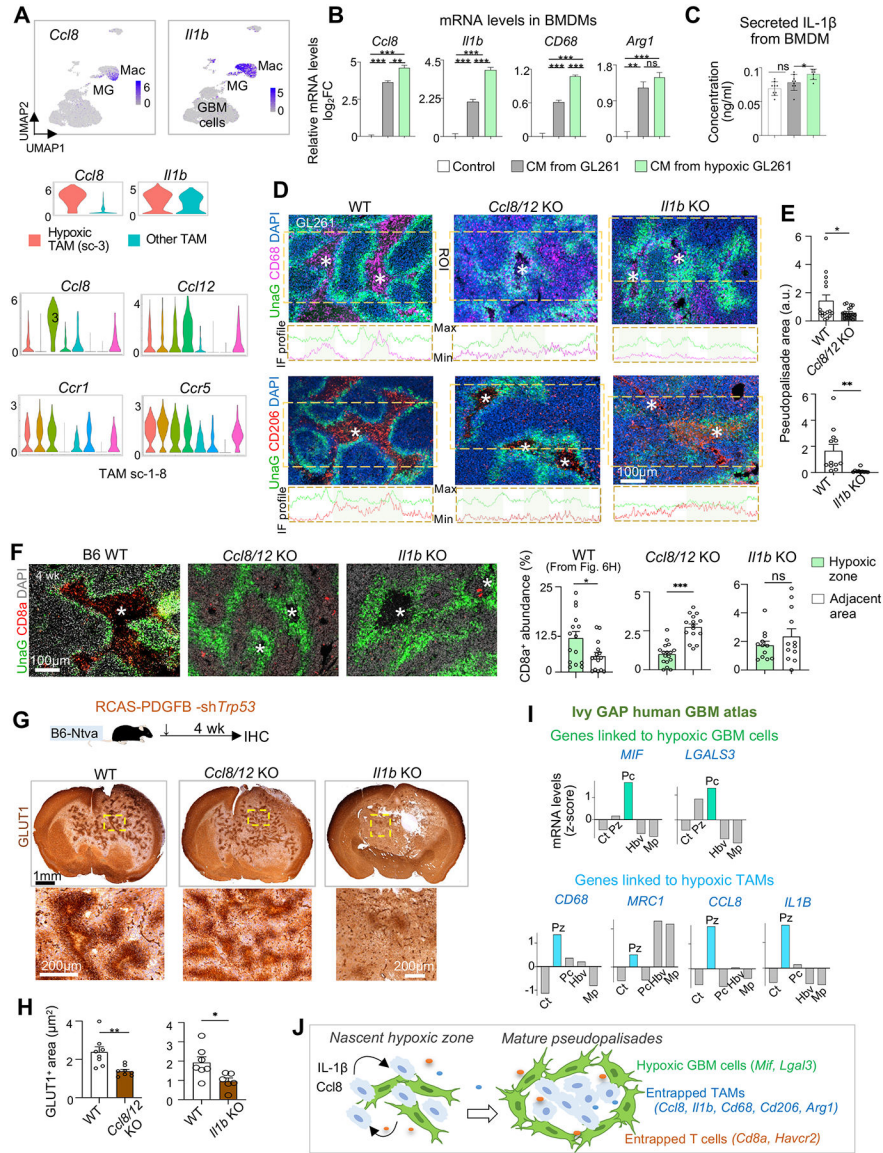
**(H)** IF image and quantifications of CD8<sup>+</sup> CTLs or FOXP3<sup>+</sup> Tregs in relation to hypoxic cores (asterisks) outlined by UnaG<sup>+</sup> cells (dashed lines) of GL261 at 4 wks post-transplant. n=15 tumor areas from 3 mice per group.

**(I)** Multiplex 5-color IF imaging from n=3 tumor sections show localization of CTLs (CD8a<sup>+</sup>) and TAMs (CD68<sup>+</sup>) in relation to hypoxic zones (UnaG<sup>+</sup>) or blood vessels (PECAM1<sup>+</sup>).

**(J, K)** IF images of fresh frozen human GBM sections stained for immune cell markers for TAMs or T cells and GLUT1 (asterisks) in hypoxic or adjacent non-hypoxic zones. DAPI for nuclear staining. Enlarged images of boxed area in (J) are shown on right.

Unpaired t-test (F, H); \* $P < 0.01$ , \*\*\* $P < 0.001$ .

See also Figures S5–S7.



**Figure 7. Progressive spatial confinement of TAMs in hypoxic zones involves CCL8 and IL-1 $\beta$ .** (A) Top, UMAP feature plots show the expression of *Ccl8* and *Il1b* in tumor-associated macrophages (Mac) as compared to other cells in GL261 GBM. Middle, violin plots show the expression of *Ccl8* and *Il1b* in sc-3 (hypoxic) TAMs vs. other TAMs combined. Bottom, violin plots show the expression of the indicated genes in TAM subclusters. (B) qRT-PCR results of gene expression in cultured BMDMs after 24 hrs exposure to conditioned media (CM) of GL261 cells grown in normal or hypoxic (1% O<sub>2</sub>) condition. n=3 wells per condition. (C) ELISA of secreted IL-1 $\beta$  from BMDMs when exposed to control or CM. n=3 wells per condition. (D) Representative IF images from n=3 mice and profile plots of IF intensities for CD68 or CD206 in region of interest (ROIs, dashed boxes) in GL261 transplanted in WT or KO hosts.



**(E)** Quantifications of abundance of pseudopalisading areas (UnaG<sup>+</sup>) in GL261 transplanted in different hosts. n=12–16 areas from 3 mice per condition. a.u., arbitrary units.

**(F)** IF images and quantifications from n=3 mice show changes in CD8a<sup>+</sup> CTL trafficking into hypoxic zones of GL261 transplanted in KO mice compared to control hosts. Asterisks denote hypoxic cores outlined by UnaG<sup>+</sup> pseudopalisades.

**(G, H)** Experimental scheme of mouse RCAS GBM model in immunocompetent B6 background (G, top). Representative IHC images for GLUT1 (G, bottom) of brains bearing RCAS GBMs generated in WT or different KO mice. Quantifications (H) show the extent of GLUT1<sup>+</sup> pseudopalisading areas in RCAS GBMs. n=6–8 hypoxic zones per genotype from n=3 mice.

**(I)** Expression of hypoxia niche genes associated with either UnaG<sup>+</sup> tumor cells (top) or entrapped TAMs (bottom) in pseudopalisading cells (Pc) or perinecrotic zones (Pz) relative to other areas based on Ivy GAP human GBM data.

**(J)** Model of hypoxia-induced TAM and CTL trafficking, cell-cell sorting, gene reprogramming into immunosuppression, and maturation of pseudopalisades.

Unpaired t-test (E, F, H); One-way ANOVA (B, C); \* $P < 0.05$ , \*\* $P < 0.01$ , \*\*\* $P < 0.001$ ; ns, not significant.

See also Figure S7.

## KEY RESOURCES TABLE

| REAGENT or RESOURCE                                | SOURCE                    | IDENTIFIER                               |
|--|---------------------------|--|
| Antibodies   |                           |  |
| Anti-Arg1 (M-20)                                   | Santa Cruz Biotechnology  | Cat#sc-18355; RRID: AB_2058957           |
| Anti-mouse CD68 (FA-11)                            | Bio-Rad                   | Cat# MCA1957GA; RRID: AB_324217          |
| Anti-CD8a (53–6.7)                                 | Thermo Fisher Scientific  | Cat# 14-0081-82; RRID: AB_467087         |
| Anti-mouse MMR/ CD206                              | R and D Systems           | Cat# AF2535; RRID: AB_2063012            |
| Anti-mouse CD16/32 (2.4G2)                         | BD Biosciences            | Cat# 553142; RRID: AB_394657             |
| Anti-FOXP3 (FJK-16s)                               | Thermo Fisher Scientific  | Cat# 14-5773-82; RRID: AB_467576         |
| Anti-GLUT1 (SA0377)                                | Thermo Fisher Scientific  | Cat# MA5-31960; RRID: AB_2809254         |
| Anti-Iba1  | FUJIFILM Wako Shibayagi   | Cat# 019-19741; RRID: AB_839504          |
| Anti-mouse CD49d / integrin alpha4 (9C10 (MFR4.B)) | BioLegend                 | Cat# 103701; RRID: AB_313042             |
| Anti-Ki67  | Abcam                     | Cat# ab15580; RRID: AB_443209            |
| Anti-cMyc tag                                      | Novus                     | Cat# NB600-335; RRID: AB_10002720        |
| Anti-CD31/ PECAM1                                  | Abcam                     | Cat# ab28364; RRID: AB_726362            |
| Anti-PU.1 (E.388.3)                                | Thermo Fisher Scientific  | Cat# MA5-15064; RRID: AB_10986949        |
| Anti-Pimonidazole Dylight 594 (4.3.11.3)           | Hydroxyprobe              | Cat# HP7-100Kit                          |
| Bacterial and virus strains                        |                           |  |
| Stbl3 E. coli                                      | Thermo Fisher Scientific  | C737303                                  |
| Biological samples                                 |                           |  |
| Primary bone marrow derived macrophages (mouse)    | This paper                | N/A                                      |
| Chemicals, peptides, and recombinant proteins      |                           |  |
| Pimonidazole                                       | Hydroxyprobe              | Cat# HP-100mg                            |
| Evofofamide/ TH-302                                | AdooQ Bioscience          | Cat# A11144                              |
| Recombinant murine M-CSF                           | Peptotech                 | Cat# 315-02                              |
| Percoll  | GE Healthcare             | Cat# 17089101                            |
| BrainBits Hibernate E Low Fluorescence             | Fisher Scientific         | Cat# NC0285514                           |
| DNase I  | Worthington               | Cat# LS006344                            |
| RBC lysis buffer                                   | BioLegend                 | Cat# 420301                              |
| Critical commercial assays                         |                           |  |
| Mouse IL-1 beta/IL-1F2 DuoSet ELISA                | R and D Systems           | Cat# DY401                               |
| DuoSet ELISA Ancillary Reagent Kit 2               | R and D Systems           | Cat# DY008                               |
| RNeasy mini kit                                    | Qiagen                    | Cat# 74104                               |
| SuperScript III First Strand Synthesis System      | Thermo Fisher Scientific  | Cat# 18080051                            |
| Neural Tissue Dissociation Kit (P)                 | Miltenyi Biotec           | Cat# 130-092-628                         |
| Deposited data                                     |                           |  |
| Analyzed scRNA-seq data                            | This paper                | Gene Expression Omnibus, GEO: GSE179077  |
| Experimental models: Cell lines                    |                           |  |
| GL261 (murine GBM cell line)                       | National Cancer Institute | NCI-DTP Cat# Glioma 261; RRID: CVCL_Y003 |

| REAGENT or RESOURCE                                     | SOURCE                                       | IDENTIFIER   |
|---|--|--|
| GL261-HRE-UnaG  | This paper                                   | N/A  |
| CT2A  | Millipore                                    | Millipore Cat# SCC194, RRID: CVCL_ZJ44   |
| HEK293T   | ATCC   | CRL-3216; RRID: CVCL_0063  |
| Experimental models: Organisms/strains                  |  |  |
| C57BL/6J  | The Jackson Laboratory                       | Strain# 000664; RRID: IMSR_JAX:000664  |
| C57BL/6J SCID; B6.Cg-Prkdc <sup>scid</sup> /SzJ         | The Jackson Laboratory                       | Strain# 001913; RRID: IMSR_JAX:001913  |
| ICR-SCID; IcrTac:ICR-Prkdc <sup>scid</sup>              | Taconic Biosciences                          | Model# ICRSC-M; RRID: IMSR_TAC:icrsc   |
| N-tva-Ccl8/12 KO  | Sabina Islam                                 | N/A  |
| N-tva-IIIb KO   | Dmitry Shayakhmetov                          | N/A  |
| Oligonucleotides  |  |  |
| Mouse <i>Arg-1</i> forward: 5'-GTGGCTTTAACCTTGGCTTG-3'  | This paper                                   | N/A  |
| Mouse <i>Arg-1</i> reverse: 5'-CTGTCTGCTTTGCTGTGATG-3'  | This paper                                   | N/A  |
| Mouse <i>Ccl8</i> forward: 5'-ACAATATCCAGTGCCCCATG-3'   | This paper                                   | N/A  |
| Mouse <i>Ccl8</i> reverse: 5'-TGAAGGTTCAAGGCTGCAG-3'    | This paper                                   | N/A  |
| Mouse <i>CD68</i> forward: 5'-ACTTCGGGCCATGTTTCTCT-3'   | This paper                                   | N/A  |
| Mouse <i>CD68</i> reverse: 5'-GCTGGTAGGTTGATGTCGT-3'    | This paper                                   | N/A  |
| Mouse <i>IIIb</i> forward: 5'-CCAAGCAACGACAAAATACC-3'   | This paper                                   | N/A  |
| Mouse <i>IIIb</i> reverse: 5'-GTTGAAGACAAACCGTTTTTCC-3' | This paper                                   | N/A  |
| Mouse <i>Gapdh</i> forward: 5'-ACTGCCACCCAGAAGACTGT-3'  | This paper                                   | N/A  |
| Mouse <i>Gapdh</i> reverse: 5'-GATGCAGGGATGATGTTCT-3'   | This paper                                   | N/A  |
| Recombinant DNA   |  |  |
| pcDNA-dUnaG   | Dr. Friedemann Kiefer                        | N/A  |
| pENTR/D-TOPO  | Thermo Fisher Scientific                     | Cat#: K240020  |
| pLenti X1 Puro DEST                                     | Addgene                                      | Plasmid# 17297; RRID: Addgene_17297  |
| pMD2.G  | Addgene                                      | Plasmid# 12259; RRID: Addgene_12259  |
| psPAX2  | Addgene                                      | Plasmid# 12260; RRID: Addgene_12260  |
| pLenti-HRE-dUnaG  | This paper                                   | Addgene #124372  |
| Software and algorithms                                 |  |  |
| Microsoft Office  | Microsoft                                    | RRID: SCR_016137   |
| Adobe Photoshop   | Adobe  | RRID: SCR_014199   |
| Fiji Is Just ImageJ (FIJI)                              | Public domain, National Institutes of Health | <a href="https://imagej.net/software/fiji/">https://imagej.net/software/fiji/</a> ; RRID: SCR_003070 |
| Prism 9   | GraphPad                                     | RRID: SCR_002798   |
| SnapGene  | Dotmatics                                    | RRID: SCR_015052   |
| Zen Blue  | Zeiss  | RRID: SCR_013672   |

| REAGENT or RESOURCE              | SOURCE                               | IDENTIFIER   |
|----------------------------------|--------------------------------------|--|
| Cell Ranger                      | 10x Genomics                         | RRID: SCR_017344   |
| Seurat R package                 | Rahul Satija Lab                     | <a href="https://satijalab.org/seurat/index.html">https://satijalab.org/seurat/index.html</a> ; RRID: SCR_007322   |
| SCRABBLE R package               | Kai Tan Lab                          | <a href="https://github.com/tanlabcode/SCRABBLE">https://github.com/tanlabcode/SCRABBLE</a>  |
| Enrichr                          | Avi Ma'ayan Lab                      | <a href="https://maayanlab.cloud/Enrichr/">https://maayanlab.cloud/Enrichr/</a> ; RRID: SCR_001575   |
| GBM Bio Discovery Portal         | NCI                                  | <a href="https://gbm-biodp.nci.nih.gov">https://gbm-biodp.nci.nih.gov</a>  |
| cBioPortal for Cancer Genomics   | MSKCC                                | <a href="https://docs.cbioportal.org/about-us/">https://docs.cbioportal.org/about-us/</a> ; RRID: SCR_014555   |
| Ivy Glioblastoma Atlas Project   | Allen Institute for Brain Science    | <a href="https://glioblastoma.alleninstitute.org">https://glioblastoma.alleninstitute.org</a> ; RRID: SCR_005044   |
| high dimensional WGCNA R package | Vivek Swarup Lab                     | <a href="https://smorabit.github.io/hdWGCNA/index.html">https://smorabit.github.io/hdWGCNA/index.html</a>  |
| Leica Application Suite X        | Leica Microsystems                   | RRID: SCR_013673   |
| Ingenuity Pathway Analysis       | Qiagen Digital Insights              | RRID: SCR_008653   |
| Gene Set Enrichment Analysis     | Broad Institute                      | RRID: SCR_003199   |
| The Cancer Genome Atlas          | National Institutes of Health        | <a href="https://www.cancer.gov/about-nci/organization/ccg/research/structural-genomics/tcga">https://www.cancer.gov/about-nci/organization/ccg/research/structural-genomics/tcga</a> ; RRID: SCR_003193 |
| Monocle3                         | Cole Trapnell Lab                    | <a href="https://cole-trapnell-lab.github.io/monocle3/">https://cole-trapnell-lab.github.io/monocle3/</a> ; RRID: SCR_018685   |
| CellPhoneDB 4.0                  | Roser Vento-Tormo Lab                | <a href="https://github.com/ventolab/CellphoneDB">https://github.com/ventolab/CellphoneDB</a> ; RRID: SCR_017054   |
| GlioVis                          | Public domain, Massimo Squatrito Lab | <a href="http://gliovis.bioinfo.cnio.es">http://gliovis.bioinfo.cnio.es</a>  |