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1Tumor Edge-to-Core Transition Promotes Malignancy in2Primary-to-Recurrent Glioblastoma Progression in a3PLAGL1/CD109-mediated mechanism

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- 51 The authors report no conflict of interest concerning the materials or the methods used in this 52 study or the findings specified in this paper.
- 53

54 Authorship Statement

55 Leading conceptualization of the study: IN. Financial support: DHN, IN. Laboratory practice: CL, 56 QC, SY, SK, SG. Bioinformatic analysis: CL, HJC, DY, DHN, IN. Schematic drawing of 57 hypothesis (Fig. 5): IN. Drafting the article: CL, IN. Critical revision of the article: HIK, DHN, IN. 58 All authors had substantial input to the logistics of the work and revised and approved the final 59 manuscript. The authors know their accountability for all aspects of the study ensuring that 60 questions regarding the accuracy and integrity of any part are appropriately investigated and 61 resolved. The corresponding authors had full access to all of the data and the final responsibility 62 to submit the publication.

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70 Abstract

Background: Glioblastoma remains highly lethal due to its inevitable recurrence. This recurrence is found locally in most cases, indicating that post-surgical tumor-initiating cells (TICs) accumulate at tumor edge. These edge TICs then generate recurrent tumors harboring new core lesions. Here, we investigated the clinical significance of the edge-to-core transition (ECT) signature causing glioblastoma recurrence and sought to identify central mediators for ECT.

77 Methods: First, we examined the association of the ETC-related expression changes and 78 patient outcome in matched primary and recurrent samples (n=37). Specifically, we tested 79 whether the combined decrease of the edge TIC marker PROM1 (CD133) with the increase of 80 the core TIC marker CD109 representing ECT during the primary-to-recurrence progression 81 indicates poorer patient outcome. We then investigated the specific molecular mediators that 82 trigger tumor recurrence driven by the ECT signature. Subsequently, the functional and 83 translational significance of the identified molecule was validated within our patient-derived 84 tumor edge-TIC models in vitro and in vivo.

Results: Patients exhibiting a CD133^{down}/CD109^{up} signature during recurrence representing ECT displayed a strong association with poorer progression-free survival and overall survival among all tested patients. Differential gene expression identified that PLAGL1 was tightly correlated with the core TIC marker CD109 and was linked to a shorter survival of glioblastoma patients. Experimentally, forced PLAGL1 overexpression enhanced, while its knockdown reduced, the glioblastoma edge-derived tumor growth *in vivo* and subsequent mouse survival, suggesting its essential role in the ECT-mediated glioblastoma development.

92 Conclusions: ECT is likely an ongoing lethal process in primary glioblastoma contributing to its
 93 recurrence partly in a PLAGL1/CD109-mediated mechanism.

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96 Key Words: recurrence-initiating cell, glioma stem cell, cancer stem cell, spatial identity

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98 Key Points

- 99 1. ECT is a pathobiological process contributing to glioblastoma lethality
- 100 2. The CD133^{down}/CD109^{up} signature is a novel prognostic molecular biomarker in ECT
- 101 3. PLAGL1 regulates growth of edge-located tumor-initiating cells

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103 Importance of the Study:

104 Verv few studies have sought to longitudinally characterize the transition of molecular 105 landscapes from primary to recurrent glioblastoma. Post-surgical edge-located TICs are 106 presumably the predominant source of tumor recurrence, yet this cellular subpopulation in 107 glioblastoma remains largely uncharacterized. This study evaluates the significance of 108 glioblastoma edge-derived core transition (ECT) for tumor recurrence in the primary-recurrent 109 paired sample set. We elucidate a prognostically-significant shift in molecular and cellular 110 phenotypes associated with ECT in the CD133^{down}/CD109^{up} group. Moreover, our results 111 provide clinical and experimental evidence that PLAGL1 is a mediator of glioblastoma ECT and 112 its subsequent tumor development by the direct transcriptional regulation of the core TIC marker 113 CD109.

115 Introduction

116 Glioblastoma is an incurable universally lethal disease¹ and characterized by inter- and intratumoral heterogeneity²⁻⁶. Transcriptome-based subtyping of individual tumors is considered a 117 118 milestone discovery of the past decade^{7,8}; nonetheless, this molecular subtyping has yet to 119 change clinical management, unlike other cancers that now have distinct treatment options instructed by particular genetic subtype information (e.g. breast cancer, neuroblastoma)^{9,10}. In 120 121 sharp contrast to the accumulating experimental evidence for the mesenchymal shift of 122 glioblastoma tumors being tightly associated with a gain of malignancy and therapy resistance 123 in various model systems, clinical data remains lacking to suggest that mesenchymal 124 glioblastoma gains benefit from more extensive and/or different therapies. In addition, multiple 125 independent large-scale studies have clarified that the transcriptomic subtype switch between 126 primary and recurrent glioblastomas is simply a random event without any clear trend of one 127 way or the other including toward the mesenchymal shift¹¹.

128 Most glioblastomas recur within a few years as the main cause of its dismal prognosis in the developed countries¹². The large degrees of molecular difference between primary and 129 130 recurrent tumors have been recognized by various OMICs analyses including deep sequencing, both with tumor tissues^{13,14} and at the single cell level¹⁵. Since the brain tissues adjacent to 131 132 surgical resection are the most frequent sites of tumor recurrence, the normal parenchyma-133 tumor core interface (tumor edge) presumably contains post-surgical tumor-initiating cells (TICs; 134 also termed recurrence-initiating cells) after craniotomy. Molecular and, more importantly, 135 phenotypic characterization of these edge-TICs may lead to the identification of a means to 136 inhibit the process of tumor recurrence following craniotomy.

Diffuse infiltrative glioblastomas, when they recur, are detected by the propagation of new tumor core lesions, indicating the edge-to-core transition (ECT) is likely critical step toward patient lethality. Nonetheless, these lethal seeds for tumor recurrence are mostly, if not entirely,

140 surgically-untouchable due to the presence of intermingled normal functional brain cells 141 including neurons. In fact, despite recent advances in surgical technology increasing the extent 142 of resection of the core lesion with the neuro-radiological confirmation of nearly 100% resection 143 of the enhancing abnormality on post-operative MRI, the improvement of post-surgical patient 144 survival remains marginal. Therefore, further attention needs to be placed on the remaining 145 edge lesions (T2/FLAIR abnormality without Gadolinium enhancement on MRI) and ECT during 146 recurrent tumor development as a clinically-significant consequence of treatment failure to 147 glioblastoma. In order to uncover the functional roles of tumor cells within this edge 148 microenvironment, our recent studies have undertaken a program to isolate and characterize 149 regionally-distinct tumor cell populations by using awake surgery to obtain reasonable amounts 150 of edge tissues without harming patients, allowing us to functional identify CD133 and CD109 as 151 the representative molecules to mark the edge-located and acquired core-associated TICs, respectively^{3,16-18}. 152

In the current study, we investigated this presumptive transition of CD133^{high}/CD109^{low} 153 cells to CD133^{low}/CD109^{high} cells as the representative of highly-lethal ECT dynamics by using 154 155 37 pairs of samples from matched primary and recurrent glioblastoma tumors. We then 156 postulated that the decline of CD133 expressing TICs and the increase of CD109-expressing 157 TICs indicates active ECT progression, worsening the patients' prognosis. To test this idea, we 158 segregated our longitudinal sample set into two groups based on the CD133/109 expression 159 changes. A set of integrated multimodal analyses was performed, followed by the pre-clinical validation of the identified molecular target as a functional key determinant for ECT-related 160 161 glioblastoma aggressiveness.

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164 Materials and Methods

165 Patients, Specimens, and Ethics

166 All 37 longitudinal glioblastoma cases were treated at Samsung Medical Center and Seoul 167 National University Hospital and the tumor tissues were collected for research under the 168 approved institutional review boards. Detailed methods are described in the previous study¹⁹ 169 and Supplementary material. For the pre-clinical studies, four patient-derived glioma sphere 170 models were used, including three pair of tumor core- and edge-derived ones (1051E and C, 171 1053E and C, 0573E and C) as well as one tumor edge-derived sphere line (101027E), which were established and described elsewhere^{3,16-18,20-22}. In short, with the signed patient consent, 172 173 the senior author (IN) performed supra-total resection of glioblastoma tumors under the awake 174 setting and resected both tumor core (T1-Gadolinium(+) tumors) and edge (T1-Gadolinium(-175)/T2-FLAIR abnormal tumors in the non-eloquent deep white matter) to achieve maximal tumor 176 cell eradication without causing any permanent major deficit in the patients (Supplementary 177 Fig.1A). After the confirmation of enough tumor tissues from both lesions secured for the clinical 178 diagnosis, remaining tissues were provided to the corresponding scientists following de-179 identification of the patient information. Both the core-derived and edge-derived glioma spheres were established in the same culture condition ^{3,16-18,20-23} and their spatial identities, termed *core*-180 181 ness and edge-ness, were confirmed by a set of xenografting experiments into mouse brains (details described in ¹⁸). Only those that passed this confirmation were used for this study. The 182 183 other patient-derived glioma sphere models were established as "core-like glioma spheres" using the same protocol and reported elsewhere¹⁸. All these patient-derived glioma models 184 185 were periodically checked with the mycoplasma test and the Short Tandem Repeat (STR) 186 analysis. All work related to pre-clinical data was performed under an Institutional Review Board 187 (IRB)-approved protocol (N150219008) compliant with guidelines set forth by National Institutes 188 of Health (NIH).

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190 Public Microarray Data Processing

191 Three RNA sequencing datasets were downloaded from the Gene Expression Omnibus 192 database(https://www.ncbi.nlm.nih.gov/geo/), including GSE63035, GSE67089 and GSE113149^{17,23,24}. RNA sequencing data of 29 longitudinal samples are derived from 193 194 GSE63035, and 8 longitudinal samples are newly added, all the samples are IDH-wild type. The GSE67089 datasets contained gene expression data of MES, PN glioma sphere cells and 195 196 Neuron progenitor cells. The GSE113149 included the microarray data for sh-NT versus sh-197 CD109 in glioblastoma sphere 267. The RNA sequencing data of TCGA database was acquired 198 from the TCGA Research Network (https://www.cancer.gov/tc- ga.) and visualized by Gliovis²⁵ 199 (http://gliovis.bioinf o.cnio.es/.).

200

201 In vitro experiments

202 Detailed methods are described in the Supplementary material.

203 in vivo mouse experiments

All animal experiments were performed at UAB under the Institutional Animal Care and Use Committee (IACUC)-approved protocol according to NIH guidelines. Detailed methods are described in the Supplementary material.

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208 Statistical Analysis

All data are presented as mean \pm SD. The number of replicates for each experiment was stated in Figure legends. Statistical differences between two groups were evaluated by two tailed *t*-test. The statistical significance of Kaplan–Meier survival plot was determined by log-rank analysis. A statistical correlation was performed to calculate the regression R² value and Pearson's correlation coefficient. Statistical analysis was performed by Prism 8 (GraphPad Software), unless mentioned otherwise in figure legend. P < 0.05 was considered as statistically significant.

216 Results

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Patients in CD133^{down}/CD109^{up} group exhibit worse prognoses with a trend towards an 217 increased mesenchymal signature

219 Based on our previous data^{17,18}, we used CD133 mRNA and CD109 mRNA to indicate edge-220 ness and core-ness, respectively, a concept that we validated with 19 paired GBM edge- and 221 core-samples(Supplementary Fig. 2). We reasoned that the loss of CD133 mRNA 222 (CD133^{down}) and gain of CD109 (CD109^{up}) were indicative of the edge-to-core transition in 223 glioblastoma. Based on the differential RNA expression profiles as determined by RNA-224 sequencing (seg) of 37 primary and recurrent glioblastoma pairs, 15 patients were assigned to the CD133^{down}/CD109^{up} group as representative of ECT, while the other 22 patients were 225 assigned as control arms (Others, either CD133^{down}/CD109^{down}, CD133^{up}/CD109^{down}, or 226 CD133^{up}/CD109^{down}) for comparison. Both groups displayed similar average age, sex, distant 227 228 recurrence profiles, and post-surgical therapy regimens. (Table 1, Supplementary Table 1). 229 We then investigated the progression-free survival and overall survival in these four groups. The 230 CD133^{down}/CD109^{up} group exhibited a substantially worse progression-free survival (p=0.024) 231 and overall survival (p=0.043) compared with others(Fig. 1A). Consistent with recent studies, 232 both primary and recurrent tumors showed no significant difference in proportion among the three transcriptomic subtypes⁶. However, there was a trend that CD133^{down}/CD109^{up} group was 233 234 enriched in tumors of the mesenchymal subtypes upon recurrence (p=0.028) (Fig. 1B). 235 Nonetheless, in this patient cohort, the mesenchymal-ness of either primary or recurrent tumors 236 did not show statistically-significant differences in prognosis. These findings suggested a significant association between the CD133^{down}/CD109^{up} signature representing ECT and poorer 237 238 patient prognoses, associated with increase of the mesenchymal subtype in the primary-to-

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recurrent glioblastoma progression.

241 Longitudinal RNA-seq analysis identifies the differential expression profile associated

242 with ECT including PLAGL1 and CD109

243 Next, we pursued a stepwise approach to identify a molecular target or targets that could 244 mediate the observed molecular and phenotypic dynamics of ECT. First, we established a data 245 analysis pipeline using all expressed genes in the RNA-seq data of the 37 longitudinal cases 246 (n=22,255) (Fig. 2A). Differential gene expression analysis identified 26 genes distinctively associated with the CD133^{down}/CD109^{up} changes (Supplementary Table 2). Unsupervised 247 248 hierarchical clustering of those genes (n=155) segregated our cohort sample (n=37) into two 249 distinctive subgroups (up- and down-regulated) (Fig. 2B, C). In order to further elucidate the 250 essential molecules governing ECT, we designed an integrated second step approach to 251 evaluate the expression of these 26 up-regulated genes in our well-characterized glioma sphere 252 models treated with either shRNA-based gene silencing of CD109 or flow cytometry to isolate 253 CD109(+) cells. To this end, we used our recently-published RNA-seg data with two well-254 characterized tumor core-like glioma sphere models; g267 for shRNA and g1005 for flow 255 cytometry¹⁷. As a result, *PLAGL1* was identified as being the gene whose expression most 256 strongly correlated with that of CD109 (FC>1.5, p<0.05) (Fig. 2A, D, Supplementary Fig. 3A, 257 **B**). Consistently, Pearson's correlation analysis of the 37 glioblastoma paired samples indicated 258 a strong linear relationship between CD109 and PLAGL1 relative expression (r = 0.7, p < 0.05) 259 (Fig. 2E). This CD109-PLAGL1 expression correlation was also observed in four clinical 260 datasets (TCGA, Rembrandt, CGGA, and CGGA GBM datasets) (Fig. 2F). gRT-PCR with two 261 additional edge- and core-derived glioma sphere models (Edge- and Core-derived g1053 262 spheres and g0573 spheres) showed that both PLAGL1 and CD109 were higher in the core-263 derived, yet CD133 was up in the edge-derived, glioma spheres in vitro (Fig. 2G).

To prospectively assess PLAGL1 localization in experimental tumors, we injected edgeor core-derived glioma spheres from 3 patients into immunodeficient mice. PLAGL1 showed its preferential expression in the tumor core-derived lesions (patient n=3) (Fig. 2H). In the patient

tumor data in TCGA, *PLAGL1* mRNA expression was relatively higher in glioblastomas
compared to lower grade gliomas (Fig. 2I). In glioblastoma, *PLAGL1* mRNA was enriched in
mesenchymal tumors (Fig. 2J). As expected, glioblastoma patients with higher PLAGL1
expression exhibited shorter survival in the TCGA database (Fig. 2K).

Since the *PLAGL1* gene encodes for C2H2 zinc finger (ZF) transcription factors (TFs)²⁶, 271 272 we sought to further confirm our results by cross-referencing them to our previously-established 273 cDNA microarray dataset with the sphere lines established from either human neonatal brains 274 (neural progenitors: NPs) or glioma patients with mesenchymal or core-like signature²³. Among 275 2,766 human TFs²⁷, 12 TFs, including *PLAGL1*, were highly overexpressed (fold change >15) in 276 mesenchymal or core-like glioma sphere lines as opposed to NP counterparts (p<0.001) (Fig. 2L), moreover, PLAGL1 was the second highest C2H2-ZF TFs in MES cells (Supplementary 277 278 Fig.4). Consistently, a volcano plot displayed PLAGL1 as a significantly upregulated gene in 279 mesenchymal or core-like glioma spheres (Fig. 4M). Gene set enrichment analysis (GSEA) 280 using the 26 upregulated genes identified their association with "HDAC1 targets" and "UV 281 response DNA damage", both of which our recent studies have identified as pathways tightly 282 correlated to CD109-driven signals in glioblastoma and their TIC models (Fig.4N)^{17,18}. Finally, 283 we explored the expression of PLAGL1 in primary GBM edge, core lesions as well as their 284 subsequent recurrent core tissues, which showed PLAGL1 higher in the core lesions in both 285 primary recurrent tumors (Fig. 40). Collectively, these clinical and experimental data suggested 286 PLAGL1 is possibly one key regulator in the edge-TICs to cause tumor core development in 287 glioblastoma.

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289 Genetic perturbation of PLAGL1 reveals its role in glioblastoma tumorgenicity in the 290 edge-TIC models

291 Following the identification of PLAGL1 as a potential candidate regulating the ECT-mediated 292 glioblastoma malignancy, we investigated the function of PLAGL1 in our glioblastoma edge-TIC 293 models to understand if its targeting holds any translational significance. To this end, we used 294 the two tumor edge-derived glioma sphere models (1051E and 101027E) for lentivirus-mediated 295 gene overexpression (PLAGL1-OE) and knockdown by shRNA (sh#1 and #2). As the control, 296 we used the non-targeting lentiviral construct (Ctrl). Western blotting confirmed both induced 297 overexpression and gene silencing in cells harboring the shRNA construct, with more efficient 298 targeting of PLAGL1 by sh#2 than sh#1 (Fig. 3A, Supplementary 5.A). In both models, 299 PLAGL1-OE displayed significantly higher *in vitro* growth rates, while their growth was largely 300 attenuated by gene silencing of PLAGL1 (Fig. 3B). Using clonal sphere formation as a 301 surrogate in vitro indicator of tumor initiating capacity, we found that PLAGL1-OE glioma 302 spheres relatively increased, whereas its gene silencing reduced it with a greater inhibitory 303 effect of sh#2 compared to sh#1 (Fig. 3C, D, Supplementary Fig. 5B). In vivo injection of 304 PLAGL1-OE glioma spheres into brains of SCID mice resulted in higher luminescent intensity 305 indicative of their larger tumor sizes by edge-TIC-derived tumor establishment, whereas the 306 shRNA-carrying xenografts displayed significantly lower signals in both of these two 307 glioblastoma edge sphere-derived tumor models (Fig. 3E). Mice with PLAGL1-OE glioma 308 sphere-derived tumors exhibited significantly worse survival with higher tumor burden, while 309 their gene silencing groups displayed improved overall survival with lower tumor burden 310 compared to the control group (Fig. 3F, Supplementary Fig.6). As expected, immunoreactivity 311 to CD109 was strongly correlated with the expression of PLAGL1 in both models (Fig. 3G). 312 Collectively, this data suggested that PLAGL1 regulates the in vitro clonality and in vivo tumor 313 development originally derived from edge-TICs.

314

315 **PLAGL1** binds to the promoter region for CD109 to regulate its transcriptional activity

316 Lastly, we sought to determine the molecular mechanisms linking the expression of PLAGL1 317 and CD109. Specifically, we tested if PLAGL1 binds to the promoter region for the CD109 gene 318 in glioblastoma edge-derived cells. Using g1051E spheres, we performed chromatin-319 immunoprecipitation with the PLAGL1 antibody, followed by gRT-PCR for the CD109 genetic regulatory element that we previously identified as its active promoter¹⁷ and detected a band 320 321 indicative of the direct transcriptional regulation of CD109 by PLAGL1 in glioblastoma edge-322 derived cells. This result was also validated with g101027E cells (Fig.4A). As expected, 323 overexpression of PLAGL1 elevates, while its silencing decreases, the expression of CD109 324 protein, determined by western blotting in both sphere models (Fig.4B). Collectively, the tightly 325 associated co-expression of PLAGL1-CD109 was, at least in part, mediated through the direct 326 transcriptional regulation of CD109 via the TF, PLAGL1.

327

328 **Discussion**

329 Patients with glioblastoma gain only limited benefit from craniotomy due to the inability to completely eliminate tumor cells from the brain^{28,29}. The lethal seeds for tumor recurrence 330 331 (recurrence-initiating cells) reside predominantly, yet not entirely, at the tumor edge surrounding 332 the resection cavity. In this study, we used CD133 and CD109 expression changes as a 333 reference to indicate ECT. The rationale for this investigation included our previous finding that 334 CD133 and CD109 are preferentially expressed within the TIC subpopulations, selectively within 335 glioblastoma edge- and core-tissues, respectively¹⁷. While expression of CD109 and CD133 336 within individual cells in tumors appear to be mutually-exclusive, previous studies indicate that 337 expression of these markers represents a dynamic molecular state⁶. One means of affecting 338 ECT is through radiation, which induces the conversion of edge-associated CD133(+)/CD109(-) 339 cells to the core-associated CD133(-)/CD109(+) cells, thereby developing therapy-resistant 340 tumors in vivo. On the other hand, core CD133(-)/CD109(+) cells themselves respond to

341 radiation by secreting factors that promote the radiation resistance of edge-located CD133+)/CD109(-) cells in vitro and in vivo. Collectively, these prior data suggest the 342 343 significance of targeting both core- and edge-TICs (marked by CD133 and CD109, respectively) 344 to achieve better outcomes of glioblastoma treatment. However, recent advances in surgical 345 technique, including the imaging-assisted fluorescence-guided surgery in the awake setting, has 346 allowed us to increase the proportion of surgical cases of total or near-total resection of the 347 tumor core lesions. Yet, edge-located tumor cells undoubtedly remain as a key therapeutic 348 target as they are the presumptive sources of recurrent tumors.

349 In the current study, we examined 37 paired primary-recurrent tumor samples to focus on 350 ECT, validating its association with poorer patient prognoses. It is important to note that both 351 tumor edge and core are composed of tumor cells in all three transcriptomic subtypes, albeit the ratios are slightly different (**Fig. 5**)¹⁸. Our findings suggest, yet do not definitely prove, relatively 352 353 weaker correlation of mesenchymal-ness, in comparison to the ECT signature, to patients' 354 poorer prognosis, at least in this patient cohort. This interpretation needs further validation with 355 more clinical evidence, ideally with prospective measurement, from multiple independent 356 groups. The ECT axis could be more clinically-relevant but it remains poorly understood how 357 similar to, or different from, the transcriptomic proneural (and classical)-mesenchymal axis it is. 358 In addition, in many craniotomies, small residual core lesions are left behind. Most likely, they 359 also contribute both directly and indirectly to the tumors to recur, as our recent study suggested¹⁸. Therefore, we need to be cautious in stating that ECT does not explain all the 360 361 clinical courses of the primary-to-recurrent glioblastoma progression. More extensive molecular 362 characterization with additional longitudinal case cohorts is warranted.

For the phenotypic characterization associated with tumor edge and ECT in glioblastoma, we believe that the recently-established tumor edge- and core-derived glioma spheres represent valuable models, as their xenografts faithfully recapitulate their spatiallydistinct tumor lesions in mouse brains. They can allow for the study the tumor recurrence

367 formation from the mixed populations of the core and edge cells⁷. Needless to say, the accuracy 368 of the resected tissue locations within the brains is critical for these spatially-identified models 369 and a number of potential hurdles have to be overcome in order to ascertain these samples 370 (e.g. brain shift, patient safety). In particular, glioblastomas tend to infiltrate into the deep white 371 matter, where a number of functional neuronal fibers run throughout the brain. Obtaining tumor 372 edge tissues from these regions without harming the patients is a critical step in allowing us to 373 establish models that faithfully recapitulate their spatially-distinct pathobiology. Further 374 characterization of our models and developing other tumor edge-reflective models would help 375 facilitate the molecular and phenotypic analyses to identify therapeutic targets in the post-376 surgical residual tumor cells at tumor edge that subsequently cause patient lethality.

377 Our data indicated the significance of targeting PLAGL1 to attenuate, yet not completely 378 eliminate, tumor initiation and propagation, accompanied by an impact on survival of tumor-379 bearing mice. As for its molecular mechanism, we found that this TF directly regulates the ECT 380 gene CD109. Our previous studies demonstrate that CD109 drives ECT, and, thus, by inference, 381 PAGL1 would be expected to do the same. Nonetheless, the role of PLAGL1 in cancer has 382 been controversial. Prior studies have shown that PLAGL1 is a tumor suppressor gene encoding an inducer of apoptosis and cell cycle arrest in various cancers³⁰⁻³² (e.g. breast cancer, 383 384 hepatoma, colon cancer). Even in glioma, one study has demonstrated the frequent loss of 385 PLAGL1 in their clinical samples. However, another study paradoxically demonstrated a protumorigenic function of PLAGL1 driven by SOX11^{33,34}. Here, using pre-clinical models, we 386 387 provide strong evidence to support the tumorigenic function of PLAGL1 in glioblastoma TICs. In 388 addition, the analysis of clinical samples using public and our own databases were consistent 389 with our experimental findings. PLAGL1-mediated signaling might be context-dependent among 390 various cancer cells, or even within gliomas. Such context-dependency is known to occur in a 391 variety of settings, including ones directly related to these studies. We previously found that 392 histone deacetylase 1 (HDAC1) is a positive transcriptional regulator that drives CD109 gene

393 expression *via* a protein complex formation with an oncogenic TF C/EBPβ, even though HDAC1

is recognized to modulate the compact chromatin structure leading to widespread repression of
 transcriptional activities in cancers and developmental somatic cells³⁵⁻³⁷. It remains unknown if
 PLAGL1 forms a larger protein complex with HDAC1 and C/EBPβ in glioblastoma and other

397 cancers.

398 In conclusion, this study provides a set of clinical and experimental data suggesting the 399 significance of targeting tumor edge-located TICs that subsequently escape current therapies to 400 develop lethal core lesions during tumor recurrence. The PLAGL1-CD109 signaling axis is likely 401 among key drivers for ECT. As the molecular and cellular complexity of glioblastoma is 402 increasingly recognized as a challenging road block to prolong survival of patients, successful 403 removal of tumor core is certainly the mandated first-step, yet it still requires us to learn how to 404 manage the tumor edge in better ways. Further phenotypic characterization of edge-TICs is 405 among key tasks ahead of us to develop effective therapies for glioblastoma.

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514 Figure Captions

515 Figure 1. CD133^{down}/CD109^{up} group exhibits worse prognoses accompanied by an 516 increase in mesenchymal signature

(A) Kaplan-Meier analysis of Overall Survival (left) and Progression-Free Survival (right) of
 glioblastoma patients in CD133^{down}/CD109^{down}, CD133^{up}/CD109^{down}, CD133^{up}/CD109^{up}, and
 CD133^{down}/CD109^{up} (red, top to bottom) with each collected remaining cases (Others, blue).
 (Log-rank test).

521 **(B)** River-plot analysis of the molecular subtype shifts from primary to recurrence in 522 $CD133^{down}/CD109^{up}$ (upper) and others (lower). (*p* =0.028, Chi square test)

523

524 **Figure 2. Longitudinal RNA-seq analysis identifies the differential expression profile** 525 **associated with ECT including** *PLAGL1* and *CD109*

526 (A) Schematic demonstration of the filtering procedure of *PLAGL1* from 22,255 genes.

(B) Heatmap depicting supervised hierarchical clusters of up- and down-regulated genes within
 recurrent glioblastomas of CD133^{down}/CD109^{up} and others.

(C) Volcano plot of RNA-seq data comparing CD133^{down}/CD109^{up} and others. Red and blue dots
 refer to up- and down-regulated genes in CD133^{down}/CD109^{up} group respectively.

(D) Scatterplot comparing expression profiles of the 26 genes from RNA-seq analysis results within our glioma sphere models; MES-g1005 (n=1) FACS-sorted into CD109 negative to positive cells and represented along the x-axis (left to right respectively), while microarray relative expression of *CD109* in MES-g267 (n=3) with shNT and shCD109 is represented along the v-axis (down- and up-ward, respectively).

536 (E) Scatterplot displaying the linear correlation between *CD109* and *PLAGL1* expressions in the

537 37 longitudinal cases. Pearson correlation coefficient (r) = 0.70 and p= 1.43E-06.

538 (F) Scatterplot displaying the linear correlation between CD109 and PLAGL1 expressions in 4

539 public databases (TCGA, Rembrandt, CGGA, CGGA GBM), based on Pearson correlation test.

540 (G) Bar graph displaying qRT-PCR results for the expression of CD109, PLAGL1, and CD133

541 within edge- and core-derived sphere culture models of 2 glioblastoma patients (g1053 and

542 g0573). Data are means \pm SD (n=3). ***p<0.001.

- (H) Representative images of immunohistochemistry (IHC) for PLAGL1 in mouse orthotopic
 xenografts with tumor core- (C) and edge(E)-derived glioma sphere models from 3 patients
 (q0573, q1053, and q1051). Scale bar 100um.
- 546 (I) Boxplot diagram demonstrating PLAGL1 relative mRNA expression profiles from TCGA
 547 database across different gliomas subtypes. *p<0.05, **p<0.01, and *** *p*<0.001.

548 (J) Boxplot diagram comparing relative expression profiles of *PLAGL1* among the 3 molecular

subtypes (CL, MES, and PN) of glioblastoma within TCGA database. ****p*<0.001.

550 (K) Kaplan-Meier survival curve of glioblastoma patients in the TCGA database. Patients were

551 categorized into a "high" or "low" expression group based on the median *PLAGL1* expression

in the Agilent 4502 microarray.

553 (L) Heatmap of displaying expression profiles of transcription factors (TF) (n=2,766) across 4

554 MES glioma sphere lines compared with the neural progenitor sphere line (NP) (n=3 for each 555 cell line).

556 **(M)** Volcano plot comparing TF gene expressions (n=2,766) across MES and NP lines, 557 highlighting *PLAGL1*.

- 558 **(N)** Up-regulated pathways in recurrent glioblastomas in CD133^{down}/CD109^{up} group.
- 559 **(O)** Representative IHC images for CD109 and PLAGL1 in primary edge and core, and 560 recurrent core tumor tissues. Scale bar 100um.

562 Figure 3. PLAGL1 overexpression enhances, while its silencing diminished, glioblastoma

563 growth in vivo, leading to affect subsequent mouse survival in the edge-TIC models

564 (A) Western blotting of two patients' tumor edge-derived glioma sphere lines (g1051E and

- 565 g101027E) after transducing with overexpression vector (OE) or shRNA targeting PLAGL1
- 566 (sh#1 or sh#2) or a nontargeting control (Ctrl).
- 567 **(B)** Line charts of *in vitro* growth of the indicated groups (***p*<0.01, n=6, one-way ANOVA).
- 568 (C) Representative images of the indicated glioma sphere lines after genetic transduction. Scale569 bar 60 µm.
- 570 **(D)** Inverse linear graphs of in vitro clonogenicity assays (limiting dilution neurosphere formation

assays) depicting the relationship between PLAGL1 expression and edge-derived GBM spheres

- 572 (g1051E, g101027E). (**p*<0.05, ***p*<0.01, ELDA analyses)
- 573 (E) Bioluminescent images (Left) and their quantifications (Right) of orthotopic mouse
- 574 xenografts established by injection of indicated g1051E and g101027E glioma sphere models.
- 575 (**p*<0.05 and ***p*<0.01, n=5, one-way ANOVA).
- 576 (F) Kaplan-Meier analysis of SCID mice harboring intracranial tumors derived from g1051E or
- 577 101027E spheres transduced with either overexpressed PLAGL1 (n=7), Ctrl(n=5),
- 578 shPLAGL1#1(n=6) or shPLAGL1#2 (n=6). **p*<0.05, ***p*<0.01, and *** *p*<0.001.
- 579 **(G)** IHC of indicated tumors in SCID mice for CD109 and PLAGL1. Scale bar 100um.
- 580
- 581 Figure 4. PLAGL1 binds to the promoter region for CD109 to regulate its transcriptional 582 activity
- 583 (A) ChIP-qPCR assay showing PLAGL1 binding to the promoter region for the CD109 gene in
- 584 g1051E and g101027E spheres. H3K9Ac is used as a positive control.

- 585 (B) Western blotting of CD109 and PLAGL1 in g1051E and g101027E spheres after transducing
- 586 with overexpression vector, shRNA targeting PLAGL1 (sh#1 or sh#2), or a non-targeting control
- 587 (Ctrl).
- 588
- 589 **Figure 5.** Schematic delineating the edge- and core-located tumor cells in glioblastoma together
- 590 with intra-tumoral CD133 and CD109 expressions in the TIC subpopulations.



0.

Survival probability

Survival times(days)

Others

Survival times(days)

p=0.024

CD133^{down}/CD109^{up}



В

0-

75·

Survival probability



Others

p=0.043

CD133^{down}/CD109^{up}

Survival times(days)





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Figure.4

bioRxiv preprint doi: https://doi.org/10.1101/2020.09.14.293753; this version posted September 15, 2020. The copyright holder for this preprint (which was not certified by peer review) is the author/funder. All rights reserved. No reuse allowed without permission.

bioRxiv preprint doi: https://doi.org/10.1101/2020.09.14.293753; this version posted September 15, 2020. The copyright holder for this preprint **Figure.5 Figure.5**

