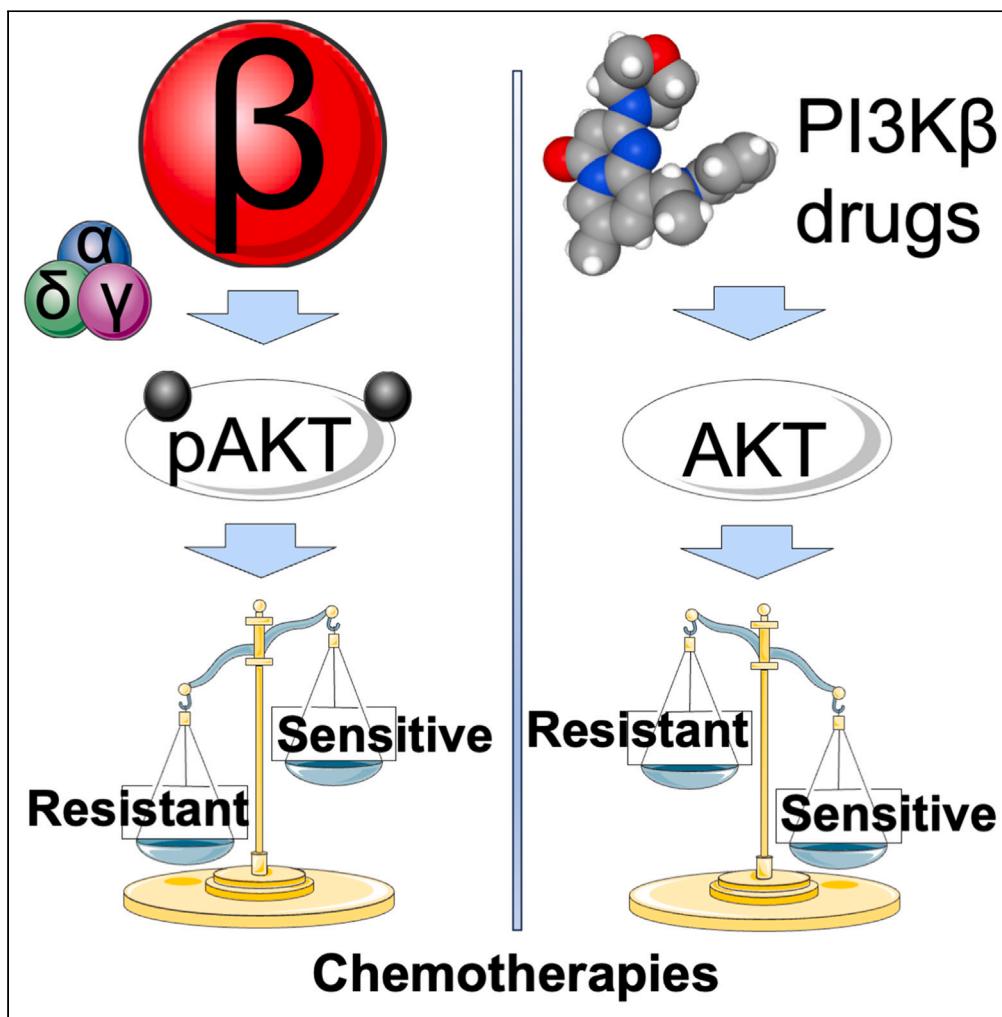


## Article

## Selective regulation of chemosensitivity in glioblastoma by phosphatidylinositol 3-kinase beta



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**Highlights**  
Divergent roles of PI3K kinases in glioblastoma's chemoresistance

PI3K $\beta$  outcompetes PI3K $\alpha/\gamma$  in chemoresistance

PI3K $\beta$  inhibitors are effective chemosensitizers

PI3K $\beta$  regulates drug sensitivity in glioblastoma stem cells



## Article

# Selective regulation of chemosensitivity in glioblastoma by phosphatidylinositol 3-kinase beta

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## SUMMARY

**Resistance to chemotherapies such as temozolomide is a major hurdle to effectively treat therapy-resistant glioblastoma. This challenge arises from the activation of phosphatidylinositol 3-kinase (PI3K), which makes it an appealing therapeutic target. However, non-selectively blocking PI3K kinases PI3K $\alpha/\beta/\delta/\gamma$  has yielded undesired clinical outcomes. It is, therefore, imperative to investigate individual kinases in glioblastoma's chemosensitivity. Here, we report that PI3K kinases were unequally expressed in glioblastoma, with levels of PI3K $\beta$  being the highest. Patients deficient of O6-methylguanine-DNA-methyltransferase (MGMT) and expressing elevated levels of PI3K $\beta$ , defined as MGMT-deficient/PI3K $\beta$ -high, were less responsive to temozolomide and experienced poor prognosis. Consistently, MGMT-deficient/PI3K $\beta$ -high glioblastoma cells were resistant to temozolomide. Perturbation of PI3K $\beta$ , but not other kinases, sensitized MGMT-deficient/PI3K $\beta$ -high glioblastoma cells or tumors to temozolomide. Moreover, PI3K $\beta$ -selective inhibitors and temozolomide synergistically mitigated the growth of glioblastoma stem cells. Our results have demonstrated an essential role of PI3K $\beta$  in chemoresistance, making PI3K $\beta$ -selective blockade an effective chemosensitizer for glioblastoma.**

## INTRODUCTION

Glioblastoma (GBM) comprises nearly half of all malignant tumors in the central nervous system, and yet it demonstrates some of the worst survival outcomes. Even with aggressive treatment, median survival is less than 15 months with one-year, five-year, and ten-year survival rates of approximately 42.9%, 6.9%, and 4.3%, respectively.<sup>1</sup> The most significant survival benefit is seen with the addition of temozolomide (TMZ), a brain-permeable alkylating agent<sup>2</sup> that forms the backbone of GBM treatment.<sup>3</sup> Compared to surgical resection with radiation alone, the addition of TMZ increases median overall survival by several months.<sup>4</sup> TMZ acts directly on DNA, forming O6-methylguanine lesions that induce DNA breaks and lead to cell death.<sup>5</sup> This action can be opposed by endogenous expression of O6-methylguanine-DNA methyltransferase (MGMT), a DNA repair enzyme that removes the O6-methylguanine lesions, making MGMT a key agent in TMZ resistance.<sup>6,7</sup> Approximately half of GBM patients demonstrate MGMT promoter hypermethylation, which reduces MGMT protein expression and lesion repair ability, thus significantly increasing GBM's sensitivity to TMZ and improving patient survival.<sup>8</sup> MGMT promoter methylation, which silences the expression of the MGMT gene (MGMT-deficient), is an important predictor of response to TMZ.<sup>9,10</sup> However, this response is often not static over the course of treatment, as MGMT-deficient GBMs develop TMZ resistance as well, mechanisms of which are often MGMT-independent, e.g., activation of different DNA-repair pathways or other cell survival pathways.<sup>11–14</sup>

The phosphatidylinositol 3-kinase (PI3K) signaling pathway has long been implicated in GBM pathogenesis. PI3K is directly downstream of several frequently mutated or amplified receptor tyrosine kinases (RTKs) in GBM, and dysregulation of the RTKs/PI3K pathway is observed in up to 88% of GBMs.<sup>15,16</sup> PI3K converts phosphatidylinositol-4,5-bisphosphate (PIP2) on the inner cell membrane into phosphatidylinositol-3,4,5-trisphosphate (PIP3), which activates AKT serine/threonine kinase (AKT) and exerts widespread effects that support GBM's proliferation, metabolism, angiogenesis, and survival as well as assist GBM cells to evade from cell death.<sup>17,18</sup> This suggests that PI3K inhibition could be a powerful means to combat TMZ resistance. Many preclinical studies have reported increased efficacy of TMZ when combined with various PI3K/molecular targets of rapamycin (mTOR) inhibitors in TMZ-resistant GBM cell lines.<sup>19–21</sup> Additionally, a phase II clinical study demonstrated

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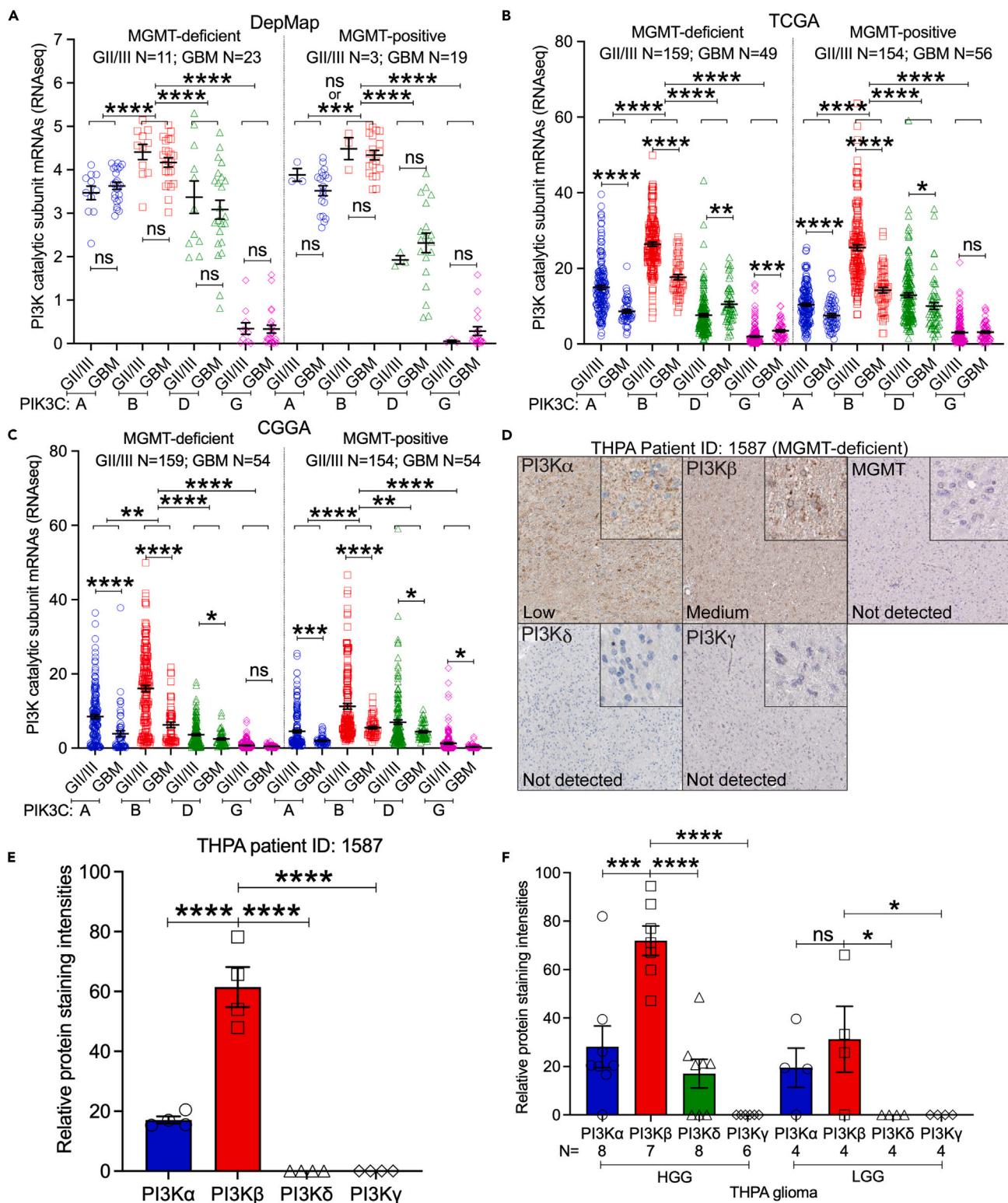
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**Figure 1.** Levels of PI3K $\beta$ /PI3K $\beta$  are the highest among the four PI3K kinases in GBM regardless of MGMT status

RNA-seq data were retrieved from DepMap, TCGA, CGGA, and THPA.

(A) Comparison of PI3K mRNAs in DepMap glioma cell lines. Cell lines from DepMap were reannotated (see Table S1). mRNA levels of PI3K kinases were compared between DepMap grade II/III (GII/III) cell lines and GBM cell lines or between MGMT-deficient and MGMT-positive cells.

**Figure 1. Continued**

- (B) Comparison of PI3K mRNAs between TCGA GII/III and GBM tumors or between MGMT-deficient and MGMT-positive tumors.
- (C) Comparison of PI3K mRNAs in CGGA gliomas.
- (D) Immunohistochemical (IHC) staining of PI3K $\alpha$ , PI3K $\beta$ , PI3K $\delta$ , PI3K $\gamma$ , or MGMT in a THPA MGMT-deficient HGG (Patient ID: 1587). Details of IHC staining are shown in the inset figures. Staining levels determined by the THPA are shown in each image.
- (E) Quantification of PI3K $\alpha$ , PI3K $\beta$ , PI3K $\delta$ , or PI3K $\gamma$  based on images shown in D using ImageJ. Four persons performed ImageJ quantification independently. Each data point stands for an intensity reading from one individual.
- (F) Quantification of PI3K $\alpha$ , PI3K $\beta$ , PI3K $\delta$ , or PI3K $\gamma$  in THPA HGG or LGG tumors. Four persons performed quantification using ImageJ. Averages of intensity readings from four persons consist of individual data points. Case numbers (N) are shown. Error bars are standard errors.  $p$  values were obtained by Student's t test or One-way ANOVA. ns: not significant; \*:  $p < 0.05$ ; \*\*:  $p < 0.01$ ; \*\*\*:  $p < 0.001$ ; \*\*\*\*:  $p < 0.0001$ .

a durable response in some participants using the pan-PI3K inhibitor PX-866 as an adjuvant monotherapy in patients who had completed some levels of standard-of-care surgical resection, radiation, and TMZ.<sup>22</sup> However, beyond this study, the heavy toxicity and severe side effects often seen with pan-PI3K inhibitors have significantly limited their evaluation for a more robust response.<sup>23–25</sup> Toxicity associated with pan-PI3K inhibition suggests a more targeted approach is needed. There are four classes of PI3K in mammals (IA, IB, II, III), but classes IA and IB are most relevant to cancer as they directly regulate PI3K activity.<sup>17,18</sup> Class IA includes PI3K $\alpha$ , PI3K $\beta$ , or PI3K $\delta$ , which are encoded by PIK3CA, PIK3CB, and PIK3CD, respectively. Class IB, predominantly expressed in immune cells, includes PI3K $\gamma$  encoded by PIK3CG. While it is well documented in *in vitro* and *in vivo* preclinical studies that multiple different isoform selective PI3K inhibitors can be effective as monotherapies or synergize with TMZ in GBM,<sup>26–31</sup> it remains elusive how PI3K kinases regulate the sensitivity of GBM to TMZ.

Recently, our group has identified one of the PI3K kinases, PIK3CB/PI3K $\beta$ , as the dominant isoform that controls GBMs' survival and growth.<sup>30,31</sup> Levels of PIK3CB/PI3K $\beta$  in GBMs are much higher than the other three kinases. Elevated levels of PI3K $\beta$  are associated with poor clinical outcomes in GBMs, particularly recurrent GBMs that are supposed to be therapy-resistant. Knockdown of PI3K $\beta$ , but not PI3K $\alpha/\delta/\gamma$ , inactivates PI3K signaling and results in a significant growth inhibition in GBM cells expressing prominent levels of PI3K $\beta$ . This pattern was verified by several PI3K isoform-selective inhibitors. It seems that GBMs having more PI3K $\beta$  depend on this kinase to survive. As an added line of evidence to support this idea, our recent investigation on a membrane protein connexin 43<sup>29</sup> has revealed that connexin 43 activates PI3K signaling through direct interaction with PI3K $\beta$  and that blocking connexin 43 and PI3K $\beta$  restores chemosensitivity in GBMs. Taken together, research from our groups and others has raised the possibility that the four PI3K kinases have different assignments in GBM's chemoresistance.

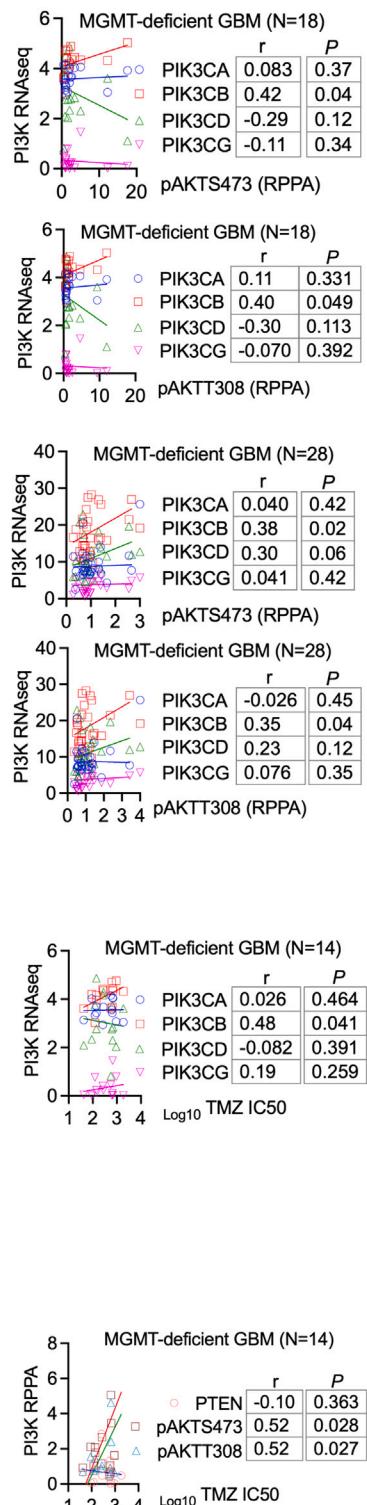
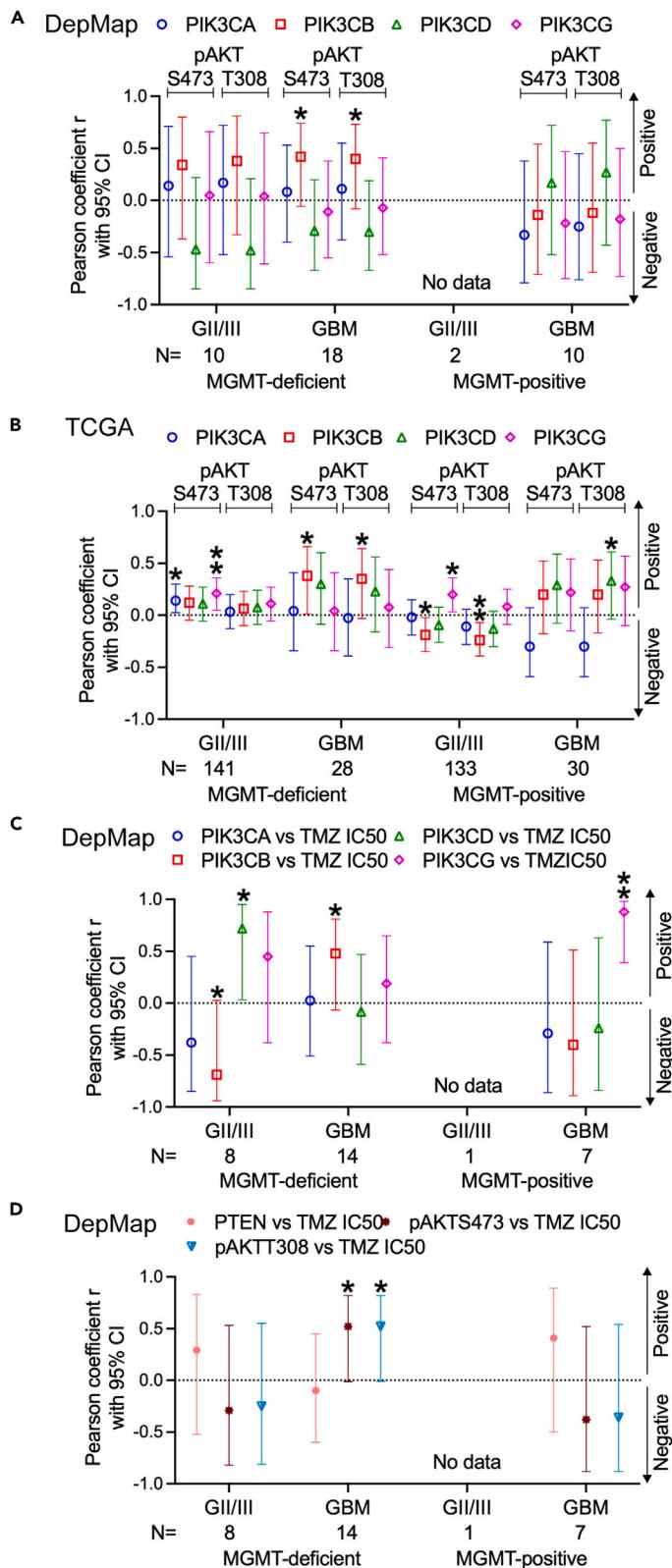
Based on prior results summarized above, we hypothesize that PI3K $\beta$  plays an essential role in MGMT-independent TMZ resistance in GBM. In this report, we have tested this hypothesis by analyzing data from online databases and measuring PI3K activity and responses to TMZ in different GBM cell lines and primary GBM stem cells (GSCs) derived from patient specimens upon CRISPR-Cas9-mediated gene knockout or treatments with isoform-selective inhibitors.

## RESULTS

### Levels of PIK3CB/PI3K $\beta$ are the highest among the four PI3K kinases in glioma

Previously, we found that PI3K genes are highly enriched in GBM.<sup>30</sup> However, it remains elusive if this enrichment is at different degrees in tumors with low or high levels of MGMT (MGMT-deficient vs. MGMT-positive). To address this, we analyzed RNA sequencing (RNA-seq) results from publicly available datasets: The Dependency Map (DepMap),<sup>32</sup> The Cancer Genome Atlas (TCGA),<sup>33</sup> Genome-Tissue Expression (GTEx),<sup>34</sup> and Chinese Glioma Genome Atlas (CGGA).<sup>35</sup> To define cell lines based on their MGMT status, we reannotated glioma cell lines (grade II to IV) used in the DepMap based upon results of literature search for MGMT expression, RNA-seq results of MGMT mRNAs (Scores <0.5 were MGMT-deficient; Scores >0.5 were MGMT-positive), and notes about misidentification and/or contamination in CellSaurus.<sup>36</sup> These analyses (Table S1) yielded 42 GBM cell lines, with 23 being MGMT-deficient and 19 being MGMT-positive, 14 grade II/III glioma cell lines including 11 MGMT-deficient and 3 MGMT-positive, and 8 normal cell lines. Consistent with our earlier findings,<sup>30</sup> only PIK3CB was enriched in glioma cell lines, but not in normal cell lines (Figure S1A,  $p < 0.01$ ), despite that more mRNAs of four PI3K kinases were found in TCGA glioma specimens than in GTEx's cerebral cortex (Figure S1B,  $p < 0.0001$ ). Levels of PIK3CB mRNAs were the highest among the four PI3K kinases in both DepMap glioma cell lines and TCGA glioma tumors (Figure S1). We next determined the expression pattern of PI3K genes in gliomas at different grades. Based upon the RNA-seq results from DepMap (Figure 1A), TCGA (Figure 1B), and CGGA (Figure 1C), PIK3CB was consistently expressed at higher levels ( $p < 0.01$  to  $<0.0001$ ) than other PI3K kinases in grade II and III (GII/III) gliomas or GBM (grade IV) regardless of MGMT levels. While mRNA quantities of PI3K genes were not different in DepMap GII/III and GBM cell lines, TCGA or CGGA GII/III tumors had more PIK3CA and PIK3CB mRNAs than GBM tumors ( $p < 0.001$  or  $p < 0.0001$ ).

We next inquired about The Human Protein Atlas (THPA),<sup>37</sup> where staining of PI3K proteins using immunohistochemistry (IHC) in gliomas is available (Table S2). In one MGMT-deficient high-grade glioma (HGG) patient (ID: 1587), levels of PI3K $\beta$  proteins were much higher than those of PI3K $\alpha$ , PI3K $\delta$ , or PI3K $\gamma$  (Figure 1D, inset figures), which was verified by ImageJ quantifications (Figure 1E,  $p < 0.0001$ ). Other HGG tumors also showed a similar expression pattern of PI3K proteins, with PI3K $\beta$  being the highest one and PI3K $\gamma$  being undetectable (Figure 1F). Different from this expression pattern in HGGs, PI3K proteins in low-grade gliomas (LGGs) showed similar levels of PI3K $\alpha$  and PI3K $\beta$ , while PI3K $\delta$  and PI3K $\gamma$  were undetected. Because PIK3CB<sup>30,38</sup> and MGMT<sup>4,39</sup> are prognostic markers for GBMs, we investigated the relationship between PI3K genes and GBM risk factors such as tumor recurrence, mutations in isocitrate dehydrogenase (IDH) genes, molecular subtypes, gender, and age.<sup>40–42</sup> In all cases tested, levels of PIK3CB were the highest among the four PI3K kinases, irrespective of tumor recurrence, IDH



**Figure 2. mRNA Levels of PIK3CB associate levels of PI3K activation and chemosensitivity in MGMT-deficient GBMs**

RNA-seq and RPPA data were retrieved from DepMap and TCGA. The Pearson correlation assay was used to determine associations between two subjects. (A) Pearson correlations between pAKTS473/T308 and levels of PIK3CA/B/D/G mRNAs in DepMap MGMT-deficient or MGMT-positive GII/III glioma cell lines or GBM cell lines. (B) Pearson correlations between pAKTS473/T308 and levels of PIK3CA/B/D/G mRNAs in TCGA MGMT-deficient or MGMT-positive GII/III gliomas or GBMs. (C) Pearson correlations between TMZ IC50s and levels of PIK3CA/B/D/G mRNAs in DepMap MGMT-deficient or MGMT-positive GII/III glioma cell lines or GBM cell lines. (D) Pearson correlations between TMZ IC50s and levels of pAKTs or PTEN in DepMap MGMT-deficient or MGMT-positive GII/III glioma cell lines or GBM cell lines. Pearson coefficients ( $r$ ) with 95% confidence intervals (95% CI) are shown. Representative Pearson correlation results in MGMT-deficient GBMs are also shown. Original results of Pearson correlation in other gliomas are shown in Figures S7, S8, S10, and S11. \*:  $p < 0.05$ ; \*\*:  $p < 0.01$ . Statistically not significant Pearson coefficients are not labeled.

mutations, molecular subtypes, or difference in gender/age (Figures S2–S6). mRNA levels of PI3K genes were not different between primary and recurrent tumors, IDH wild-type (IDH-wt) and mutant (IDH-mut) tumors, male and female, young (age <60 years) and old (age >60 years) patients, or molecular subtypes (classical, mesenchymal, and proneural). Collectively, our results have shown that PI3K kinases are differentially expressed in gliomas and that mRNAs and proteins of PIK3CB/PI3K $\beta$  are highly enriched in GBM regardless of MGMT status.

**Levels of PIK3CB/PI3K $\beta$  associate with levels of PI3K activation and chemosensitivity in MGMT-deficient GBMs**

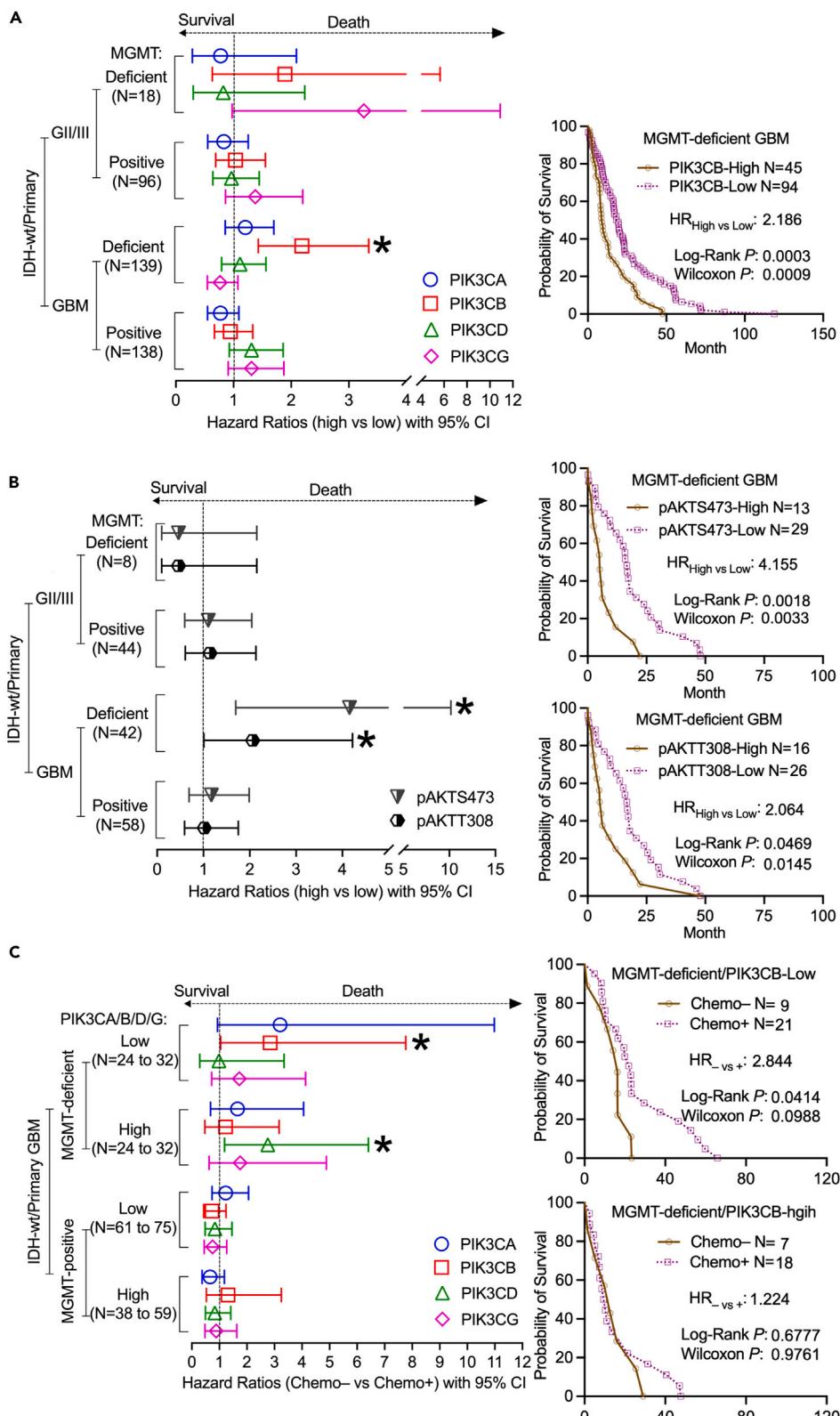
We have previously shown that PIK3CB/PI3K $\beta$  activates PI3K in GBM cells,<sup>30</sup> suggestive of a correlation between PIK3CB/PI3K $\beta$  levels and PI3K activities. We, therefore, interrogated if levels of PIK3CB/PI3K $\beta$  are functionally relevant to PI3K activities and chemosensitivity in GBMs with various levels of MGMT. As shown in Figures 2A and S7, we retrieved data of phosphorylated proteins, including phosphorylated AKTs (pAKTS473/T308) determined by the reverse phase protein array (RPPA) from DepMap and TCGA. By using the Pearson coefficient, which shows correlations of two subjects, we found that levels of PIK3CB mRNAs positively correlated with levels of pAKTS473/T308 in MGMT-deficient GBM cell lines but not in MGMT-deficient GII/III glioma cell lines and MGMT-positive cell lines, whereas no statistically significant interconnections were detected between pAKTS473/T308 and mRNAs of PIK3CA/D/G. The significant correlation between pAKTS473/T308 and PIK3CB mRNAs ( $p < 0.05$ ) was recapitulated in MGMT-deficient TCGA GBM tumors (Figures 2B and S8;  $p < 0.05$ ). However, different from DepMap cell lines, TCGA tumors showed complicated correlations between levels of PI3K genes and pAKTS473 or pAKTT308 with most cases being not statistically significant ( $p > 0.05$ ). In the cases with  $p$  values less than 0.05, levels of PI3K mRNAs were either associated with pAKTS473 only or with pAKTT308 only (e.g., PIK3CA/pAKTS473 in MGMT-deficient GII/III gliomas, PIK3CG/pAKTS473 in MGMT-positive GII/III gliomas, and PIK3CD/pAKTT308 in MGMT-positive GBMs). Unexpected, levels of PIK3CB mRNAs negatively correlated with pAKTS473/T308 in MGMT-positive GII/III gliomas. These random correlations between PI3K genes and pAKTS473 or pAKTT308 in TCGA tumors suggest that, although PI3K genes are enriched, it does not have a definitive impact on PI3K activation in MGMT-deficient or MGMT-positive GII/III gliomas and MGMT-positive GBMs, which have further verified the significance of PIK3CB in activating PI3K selectively in MGMT-deficient GBMs.

Phosphatase and tensin homolog (PTEN), as a PI3K inhibitor, is responsible for the full activation of PI3K.<sup>43,44</sup> It is, therefore, expected that PTEN levels inversely correlate with levels of pAKTS473/T308 and PI3K kinases. PTEN protein levels did not show any interconnections with either pAKTS473/T308 or mRNA levels of PIK3CA/B/D/G in DepMap GBM cell lines (Figure S9A); however, TCGA gliomas (GII/III and GBM) did exhibit negative Pearson coefficients between PTEN proteins and pAKTS473/T308 or mRNAs of one or more of PI3K kinases (Figure S9B). While these results have demonstrated the negative impact of PTEN on PI3K activation, it seems that PIK3CB does not cooperate with PTEN to activate PI3K signaling, particularly in MGMT-deficient GBMs, suggestive of a dispensable role of PTEN in these tumors.

Next, we determined if levels of PI3K genes had indications in TMZ response, as PI3K is key for TMZ resistance.<sup>19–31</sup> To test this, we collected TMZ's half maximal inhibitory concentrations (IC50s) in DepMap glioma cell lines or acquired TMZ IC50s by ourselves (Table S3). Pearson correlation analyses detected a positive trend between TMZ IC50s and PIK3CB mRNAs in MGMT-deficient GBMs. (Figures 2C and S10;  $p < 0.05$ ). In MGMT-deficient GII/III gliomas, PIK3CB mRNA levels negatively, while PIK3CD mRNA levels positively, correlated with TMZ IC50s (Figures 2C and S10;  $p < 0.05$  or  $p < 0.01$ ). Unexpectedly, levels of PIK3CG positively correlated with TMZ IC50s in MGMT-positive GBMs, which is difficult to be explained by the extremely low levels of PIK3CG in these tumors (Figure 1B). As expected from the results of PIK3CB mRNAs, there was a positive interaction between TMZ IC50s and pAKTS473/T308 (Figures 2D and S11;  $p < 0.05$ ). Statistically significant correlations between TMZ IC50s and pAKTS473/T308 or PTEN were not found in all other gliomas (Figures 2D and S11;  $p > 0.05$ ), congruent with no association of PTEN with PI3K activation (Figure S9). Results presented above have demonstrated that levels of PIK3CB, but not those of PTEN or other PI3K kinases, associate with levels of PI3K activation and responses to TMZ in MGMT-deficient GBMs.

**PIK3CB predicts clinical outcomes of MGMT-deficient GBMs**

We have previously shown that PIK3CB levels are associated with a high incidence of GBM recurrence,<sup>30</sup> a clinical condition often resulting from therapy resistance.<sup>45</sup> In line with the above results that MGMT-deficient GBMs with high levels of PIK3CB showed resistance to TMZ, we hypothesize that PIK3CB levels would predict clinical outcomes of MGMT-deficient GBMs. To test this hypothesis, we utilized TCGA, CGGA, and 11 more GBM datasets (Table S4) and collected gene expression and clinical data from 114 IDH-wt GII/III gliomas and 377 IDH-wt GBM patients. We focused on IDH-wt primary gliomas in this study because IDH-mut tumors often display increased sensitivity to chemotherapies,



**Figure 3. PIK3CB predicts clinical outcomes of MGMT-deficient GBMs**

RNA-seq/RPPA data and associated clinical data were retrieved from TCGA, CGGA, and other GBM datasets downloaded from the GlioVis online program. Results from primary MGMT-deficient/IDH-wt gliomas were pooled together for Kaplan-Meier survival analyses using JMP and Prism 10. Plotted are the resulting HRs with 95% CIs (HR > 1: more chance of death; HR < 1: more chance of survival).

(A) Comparison of high and low levels of PI3K kinases in primary MGMT-deficient/IDH-wt or MGMT-positive/IDH-wt GII/III or GBM patients.

(B) Comparison of high or low levels of pAKTs in primary MGMT-deficient/IDH-wt or MGMT-positive/IDH-wt GII/III or GBM patients.

(C) Comparison of untreated (Chemo-) and treated (Chemo+) cases in primary MGMT-deficient/IDH-wt or MGMT-positive/IDH-wt GII/III or GBM patients expressing various levels of PI3K kinases. Representative Kaplan-Meier survival curves in MGMT-deficient GBMs are shown. Other Kaplan-Meier survival curves can be found in Figures S12–S14. HRs, Log Rank Ps (long-term survival), and Wilcoxon Ps (short-term survival) with 95% CIs are shown. Only statistically significant HRs are marked with \*. \*:  $p < 0.05$ .

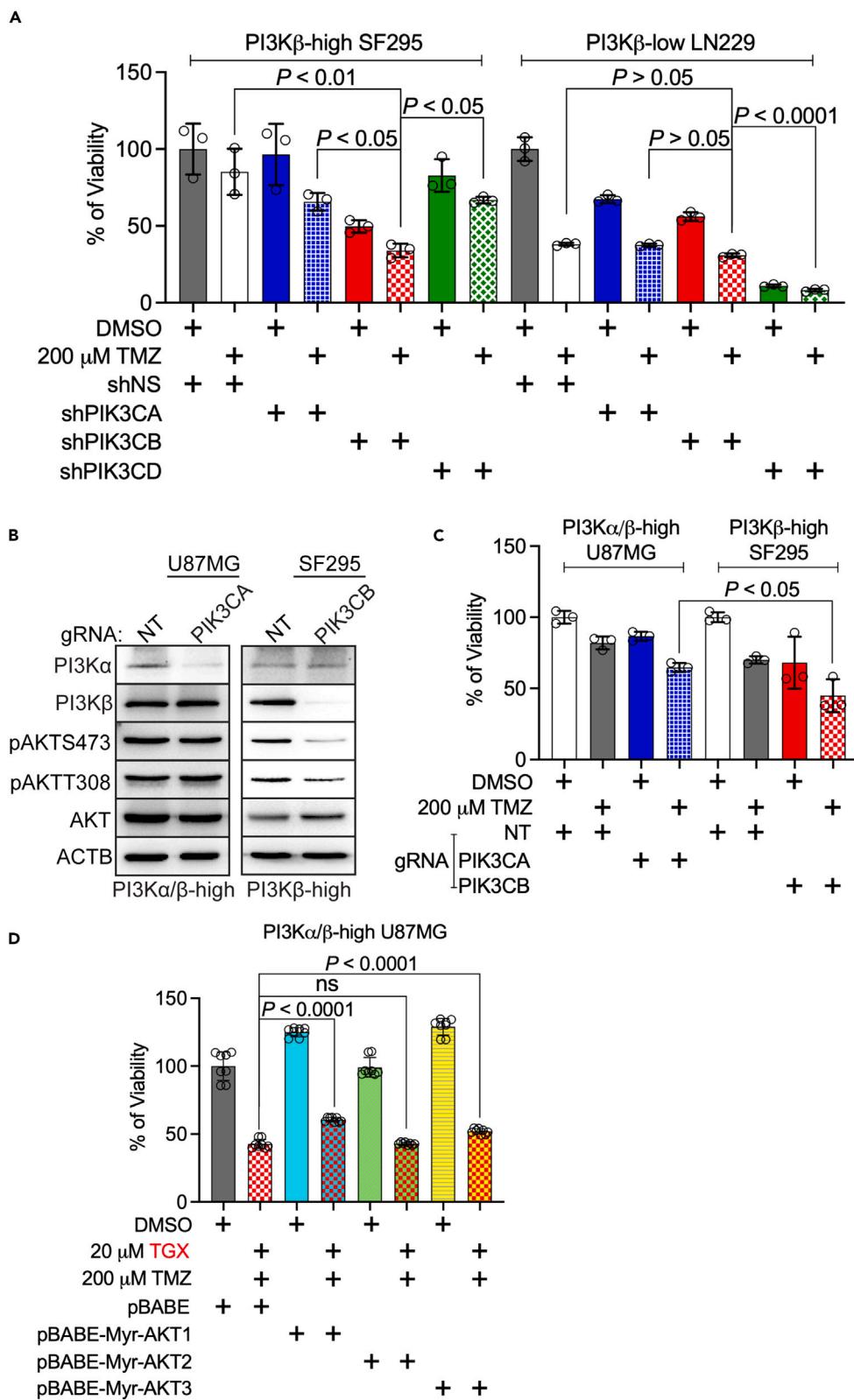
thereby displaying better clinical outcomes than IDH-wt patients.<sup>46,47</sup> Additionally, PI3K has been identified as a prognostic factor for IDH-wt tumors,<sup>48</sup> and clinical relevance of PIK3CB in recurrent GBMs has also been established in our previous work.<sup>30</sup> By using the Cox hazard proportional model, we acquired hazard ratios (HRs), which indicate a considerable risk of death and poor prognosis if HR > 1. We also performed the Log Rank analysis to determine the significance of long-term survival and the Wilcoxon analysis to determine short-term survival. We found that HRs of MGMT-deficient/IDH-wt patients with high levels of PIK3CB were 1.891 (GII/III) or 2.186 (GBM), respectively, and that only primary MGMT-deficient/IDH-wt GBMs had statistically significant worse prognosis (Log Rank  $p = 0.0003$ /Wilcoxon  $p = 0.0009$ , Figures 3A and S12). No significant HRs of PI3K genes were detected in GII/III and MGMT-positive tumors, verifying the importance of PIK3CB in MGMT-deficient primary GBMs. High levels of pAKTS473 (HR = 4.155, Log Rank  $p = 0.0018$ /Wilcoxon  $p = 0.0033$ ) or pAKTT308 (HR = 2.064, Log Rank  $p = 0.0469$ /Wilcoxon  $p = 0.0145$ ) correlated with imminent risk of death in primary MGMT-deficient/IDH-wt GBMs, but not in other gliomas (Figures 3B and S13). Given the strong correlations between PIK3CB and pAKTS473/T308 or between PIK3CB and TMZ IC50s (Figure 2), it is not surprising that GBM patients with prominent levels of PIK3CB will experience poor prognosis.

We next sought to determine if PIK3CB is associated with chemoresistance in GBMs, given its prognostic potential in IDH-wt MGMT-deficient primary GBMs. To test this, we compared untreated patients (Chemo-) with those treated (Chemo+). HR<sub>-vs+</sub> shows the risk of death if untreated. We found that primary MGMT-deficient/IDH-wt GBMs responded well to chemo treatments if PIK3CB levels were low because Chemo- patients had much shorter long-term and Chemo+ patients lived longer than those untreated (Figures 3C and S14; HR<sub>-vs+</sub> = 2.844, Log Rank  $p = 0.0414$ /Wilcoxon  $p = 0.0988$ ). In contrast, primary MGMT-deficient/IDH-wt GBMs with high levels of PIK3CB exhibited limited benefits from chemotherapies manifested by no difference in prognosis between Chemo+ and Chemo- patients (Figure 3C; HR<sub>-vs+</sub> = 1.224, Log Rank  $p = 0.6777$ /Wilcoxon  $p = 0.9761$ ). We next analyzed the effect of PI3K genes on chemotherapies in Chemo+ patients. MGMT-deficient/IDH-wt patients with low levels of PIK3CB lived much longer than patients with high levels of PIK3CB (Figure S15; HR<sub>high vs low</sub> = 2.046, Log Rank  $p = 0.0447$ /Wilcoxon  $p = 0.0305$ ), further confirming chemoresistance in patients with high levels of PIK3CB. Other PI3K kinases did not change the clinical outcomes of Chemo+ patients (Figures 3C, S14, and S15;  $p > 0.05$ ), except that MGMT-deficient/IDH-wt patients with high levels of PIK3CD responded well to chemotherapy (Figure S14; HR = 2.759, Log Rank  $p = 0.0183$ /Wilcoxon  $p = 0.0706$ ), thereby having a good prognosis (Figure S15; HR = 0.4427, Log Rank  $p = 0.0213$ /Wilcoxon  $p = 0.0632$ ). MGMT-positive GBMs were resistant to chemotherapy regardless of levels of PI3K genes (Figures 3C, S14, and S15). Collectively, PIK3CB, but not other PI3K kinases, accurately predicts the survival and chemosensitivity of primary MGMT-deficient/IDH-wt GBMs, thereby serving as a prognostic biomarker.

**PIK3CB/PI3K $\beta$ , but not other PI3K kinases, activates PI3K signaling and regulates TMZ sensitivity in MGMT-deficient GBMs**

Results from online datasets have strongly suggested that PI3K kinases play divergent roles in regulating GBM's chemosensitivity and that PIK3CB/PI3K $\beta$  could be the dominant kinase in this activity. To further clarify the role of PI3K kinases, we knocked down the individual kinases in MGMT-deficient SF295 cells<sup>49</sup> or LN229 cells.<sup>50</sup> We have previously shown<sup>30</sup> that SF295 cells express elevated levels of PI3K $\beta$  (PI3K $\beta$ -high), and LN229 cells have low levels of PI3K $\beta$  (PI3K $\beta$ -low). Because PIK3CG/PI3K $\gamma$  was barely detected in GBM,<sup>30</sup> we only tested shRNAs against PIK3CA/PI3K $\alpha$  (shPIK3CA), PIK3CB/PI3K $\beta$  (shPIK3CB), or PIK3CD/PI3K $\delta$  (shPIK3CD). The knockdown efficiency of PI3K genes by these shRNAs has been validated previously.<sup>30</sup> We found that shPIK3CA (blue bars), shPIK3CD (green bars), or 200  $\mu$ M TMZ together with the control non-silencing shRNA (shNS, white bars) significantly reduced the viability of PI3K $\beta$ -low LN229 cells, but not PI3K $\beta$ -high SF295 cells (Figure 4A). Ablation of PIK3CB alone (red bars) induced a modest growth inhibition in both cells despite that more cytotoxic effect was found in SF295 cells. Of note, shPIK3CA (dotted blue bars), shPIK3CB (dotted red bars), or shPIK3CD (dotted green bars) exacerbated growth inhibition in both SF295 and LN229 cells upon a combinational use of TMZ. However, shPIK3CB/TMZ exhibited significantly stronger cytotoxicity to SF295 cells ( $p < 0.05$  or  $p < 0.01$ ) than shPIK3CA/TMZ and shPIK3CD/TMZ. There was no significance in LN229 cells received these combinational treatments ( $p > 0.05$ ). Perturbation of PI3K kinases, particularly PIK3CD (Figure 4A, shPIK3CD), ameliorated the survival of LN229 cells, consistent with our previous work in which we have shown that PI-3065, a PI3K $\delta$  inhibitor, induced significant growth inhibition in LN-229 cells.<sup>30</sup> However, depleting PIK3CD had no effect on PI3K activation in PI3K $\beta$ -low cells as shown in our earlier report.<sup>30</sup> These results together suggest that the cytotoxic effect by inhibiting PIK3CD in PI3K $\beta$ -low cells is independent of PI3K signaling. Hence, we have shown that PI3K $\beta$ -high SF295 cells selectively respond to shPIK3CB/TMZ.

To validate the above results, we treated MGMT-deficient U87MG cells that highly express both PI3K $\alpha$  and PI3K $\beta$  (PI3K $\alpha/\beta$ -high) and PI3K $\beta$ -high SF295 cells with a guide RNA (gRNA) of PIK3CA or PIK3CB, respectively. Compared to gRNA of non-targeting (NT), PIK3CA gRNA depleted PI3K $\alpha$  but did not change levels of PI3K $\beta$  and failed to mitigate PI3K activity in PI3K $\alpha/\beta$ -high U87MG cells (Figure 4B, left panel). In contrast, PIK3CB gRNA ablated PI3K $\beta$  without affecting PI3K $\alpha$  and inactivated PI3K in PI3K $\beta$ -high SF295 cells (Figure 4B, right panel).



**Figure 4. PIK3CB/PI3K $\beta$ , but not other PI3K kinases, activates PI3K signaling and regulates TMZ sensitivity in MGMT-deficient GBMs**

(A) Combinations of TMZ and knockdown of individual PI3K kinases. PI3K $\beta$ -high SF295 or PI3K $\beta$ -low LN229 cells were transfected with viruses harboring non-silencing (NS) shRNA or shRNA of PIK3CA, PIK3CB, or PIK3CD. Cells were then treated with DMSO or 200  $\mu$ M TMZ. 4 days after treatment, cell viability was measured using the MTS assay. Cells treated with shNS and DMSO serve as controls (100% of viability).

(B) Knockout of PI3K $\alpha$  or PI3K $\beta$ . PI3K $\alpha$ / $\beta$ -high U87MG cells were transduced with viruses harboring gRNA of non-targeting (NT) or PIK3CA. PI3K $\beta$ -high SF295 cells were transduced with viruses harboring gRNA of NT or PIK3CB. Levels of PI3K $\alpha$ , PI3K $\beta$ , or PI3K signaling were monitored using immunoblotting.  $\beta$ -actin (ACTB) was the loading control.

(C) Combinations of TMZ and knockout of PI3K $\alpha$  or PI3K $\beta$ . PI3K $\alpha$ / $\beta$ -high U87MG or PI3K $\beta$ -high SF295 cells were transduced with viruses having gRNAs of NT, PIK3CA, or PIK3CB. Cells were then treated with DMSO or 200  $\mu$ M TMZ. 4 days after treatments, cell viability was measured using the MTS viability assay. Cells treated with NT gRNA and DMSO serve as controls (100% of viability).

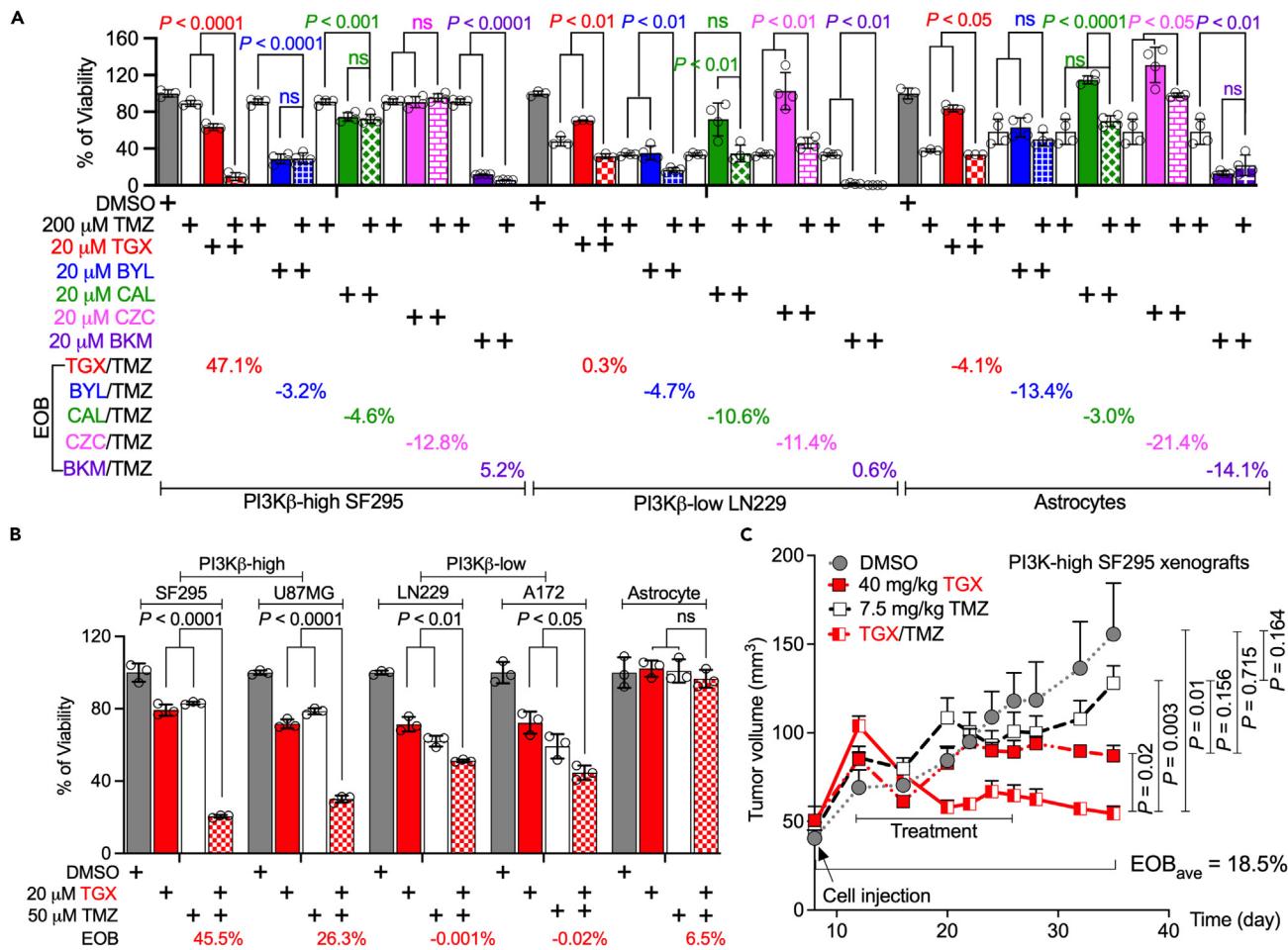
(D) Overexpression of active AKT1, AKT2, or AKT3. PI3K $\alpha$ / $\beta$ -high U87MG cells were transduced with viruses having pBABE (vector control) or plasmids with active myristoylated AKT isoforms (pBABE-Myr-AKT1, pBABE-Myr-AKT2, or pBABE-Myr-AKT3). Cells were then treated with 20  $\mu$ M of TGX-221 (PI3K $\beta$ -selective inhibitor) and 200  $\mu$ M TMZ. Cell viability was measured using the MTS assay. Cells treated with DMSO and pBABE serve as controls (100% of viability). Error bars are standard deviations derived from three to four independent replicates. Student's t test and One-Way ANOVA were used to determine  $p$  values. ns: not significant.

Given that PIK3CA gRNA had no effect on PI3K $\beta$  expression, PI3K $\beta$  is expected to retain PI3K activity upon PI3K $\alpha$ -depletion as shown in Figure 4B. In PI3K $\beta$ -depleted SF295 cells, PI3K $\alpha$  is unable to compensate the loss of PI3K $\beta$  to activate PI3K, however. This finding is consistent with our previous results in which shRNAs of PIK3CB, but not those of PIK3CA or PIK3CD, inactivated PI3K signaling in U87MG cells.<sup>30</sup> Hence, PI3K $\beta$  dominates in PI3K activation in PI3K $\beta$ -high GBM cells. This selective activation of PI3K induced by PI3K $\beta$  was further verified by the stronger cytotoxic effect exhibited by PIK3CB gRNA (red dotted bar) than PIK3CA gRNA (blue dotted bar) when combined with TMZ (Figure 4C,  $p < 0.05$ ). To prove that PI3K $\beta$  acts upstream of AKT in cell survival, we ectopically expressed active (myristoylated) AKT1, AKT2, and AKT3 in U87MG cells. Interestingly, activation of AKT1 (cyan bars) or AKT3 (light green bars), but not AKT2 (yellow bars) rendered GBM cells less responsive to the combination of TGX-221 and TMZ (Figure 4D). TGX-221 is a PI3K $\beta$ -selective inhibitor as its IC<sub>50</sub> to PI3K $\beta$  activity is 100-fold lower than those to other PI3K kinases.<sup>51</sup> The counteraction of active AKT1 and AKT3 against TGX-221 suggests that they act downstream of PI3K $\beta$ . Indeed, the importance of AKT1 and AKT3 in GBM's chemoresistance has been previously established.<sup>28,52–54</sup> Moreover, PI3K $\alpha$ -E545K, which constitutively activates AKT in U87MG and SF295 cells,<sup>29</sup> rescued these cells from growth inhibition induced by TGX-21 at different doses (Figure S16), further verifying the vital role of activated PI3K $\beta$ /AKT in GBM's survival. Overall, our results have demonstrated that PIK3CB/PI3K $\beta$  is more important than other PI3K kinases in activating PI3K and causing TMZ resistance.

**PI3K $\beta$  inhibition synergizes with TMZ to block the growth of PI3K $\beta$ -high MGMT-deficient GBMs**

The results described above strongly suggest that targeting PIK3CB/PI3K $\beta$  could significantly impact TMZ resistance. We have previously found that PI3K $\beta$  inhibitors are more selectively toxic to PI3K $\beta$ -high GBMs than other PI3K inhibitors.<sup>29,30</sup> We, therefore, hypothesized that the combination of PI3K $\beta$  inhibitors and TMZ would yield synergistic cytotoxicity to PI3K $\beta$ -high GBMs. To test this hypothesis, we treated MGMT-deficient SF295, LN229, and astrocytes with 200  $\mu$ M TMZ, a lethal dose used in our earlier work.<sup>13</sup> Compared to PI3K $\beta$ -low LN229, PI3K $\beta$ -high SF295 cells were resistant to 200  $\mu$ M TMZ (Figure 5A, white bars). PI3K isoform-selective inhibitors such as PI3K $\beta$  inhibitor TGX-221 (TGX, red bars), PI3K $\delta$  inhibitor CAL101 (CAL; green bars), or PI3K $\gamma$  inhibitor C2C24832 (C2C, pink bars) did not induce remarkable growth inhibition at the dose of 20  $\mu$ M; however, PI3K $\alpha$  inhibitor BYL-719 (BYL, blue bars) or pan PI3K inhibitor BKM120 (BKM, purple bars) suppressed the viability of three cell lines significantly by itself. When combined with TMZ (dotted bars), TGX/TMZ yielded statistically lower cell viabilities than TGX or TMZ alone ( $p < 0.0001$ , 0.01, or 0.05 in SF295, LN229, and astrocyte, respectively). Other PI3K inhibitors either displayed no significant difference between combinations and single agents (e.g., BYL in SF295, CAL in all three cell lines, C2C in SF295, and BKM in astrocytes) or even promoted cell survival when combined with TMZ (e.g., CAL in astrocytes and C2C in LN229 and astrocytes). These diverse responses were more significant when using Excess of Bliss (EOB) to measure drug interaction (EOB > 0, synergistic effect; EOB = 0, no effect; EOB < 0, antagonistic effect). EOB of TGX/TMZ was 47.1% in SF295 cells, much higher than those of TMZ and other PI3K inhibitors (EOBs = -12.8%–5.2%). PI3K inhibitors, including TGX, did not synergize with TMZ in LN229 cells (EOB = -11.4%–0.6%) and astrocytes (EOB = -21.4% to -3%). This unique drug synergy between TMZ and the PI3K $\beta$  inhibitor in PI3K $\beta$ -high GBM cells has proven the necessity of selectively targeting PI3K $\beta$  in overcoming GBM's chemoresistance. Because TMZ at 200  $\mu$ M induced significant cell death in astrocytes (Figure 5A, white bars in astrocytes), suggesting possible harmful effects on normal brain, we reduced TMZ's dose to 50  $\mu$ M and tested if 50  $\mu$ M TMZ would synergize with TGX while having minimal side effects. We found that 20  $\mu$ M TGX (red bars) or 50  $\mu$ M TMZ (white bars) alone did not robustly inhibit the proliferation of PI3K $\beta$ -high MGMT-deficient SF295 and U87MG cells; however, TGX/TMZ (dotted red bars) synergistically suppressed cell survival (Figure 5B). This effect was further verified by the EOB of 45.5% or 26.3% in SF295 and U87MG cells, respectively. No drug interactions were detected in PI3K $\beta$ -low MGMT-deficient cells (EOB = -0.02%–2.2%). Whilst the EOB of TGX/TMZ was 6.5% in astrocytes, this combination had almost no effect on the viability of astrocytes, suggesting that TGX/TMZ at these doses has negligible side effects to normal brain. It seems that PI3K $\beta$  is dispensable for astrocytes even though astrocytes express elevated levels of PI3K $\beta$ .<sup>30</sup>

To further corroborate the results from cultured cells, we treated immunodeficient mice harboring human SF295 xenograft tumors with 40 mg/kg of TGX and/or 7.5 mg/kg of TMZ. While TGX-treated (red squares) or TMZ-treated (white squares) tumors grew slower than DMSO-treated tumors (Figure 5C, gray circles), there were no statistically significant differences in tumor volumes ( $p > 0.05$ ). In stark contrast, the TGX/TMZ combination drastically lowered tumor volumes compared to each treatment alone ( $p < 0.05$ ). Intriguingly, tumor volumes in



**Figure 5. PI3K $\beta$  inhibition synergizes with TMZ to block the growth of PI3K $\beta$ -high MGMT-deficient GBMs**

(A) Combinations of TMZ and PI3K inhibitors. PI3K $\beta$ -high SF295, PI3K $\beta$ -low LN229, and PI3K $\beta$ -high astrocytes were treated with 200  $\mu$ M of TMZ and/or 20  $\mu$ M of different PI3K inhibitors, e.g., PI3K $\alpha$  inhibitor BYL719 (BYL in blue), PI3K $\beta$  inhibitor TGX-221 (TGX in red), PI3K $\delta$  inhibitor CAL101 (CAL in green), PI3K $\gamma$  inhibitor C2C4832 (C2C in pink), and the pan PI3K inhibitor BKM120 (BKM in purple).

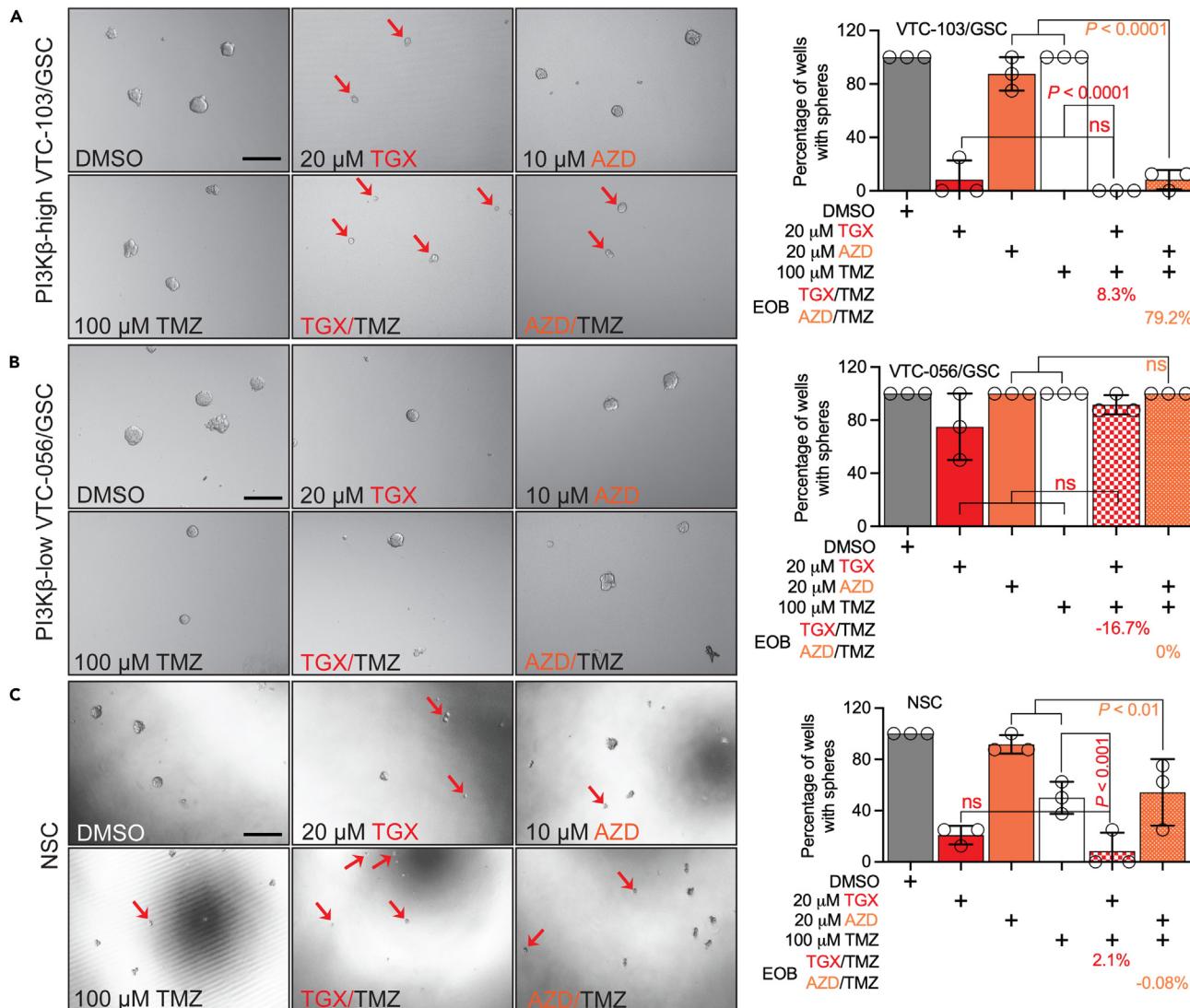
(B) Combinations of 50  $\mu$ M TMZ and 20  $\mu$ M TGX. PI3K $\beta$ -high SF295/U87MG, PI3K $\beta$ -low LN229/A172, and astrocytes were treated with 50  $\mu$ M of TMZ and/or 20  $\mu$ M TGX. Cell viability was measured using the MTS viability assay.

(C) Mice experiments. 6–8 weeks old SCID/Beige mice were injected subcutaneously with SF295 cells. 11 days later, mice were treated with 7.5 mg/kg of TMZ and/or 40 mg/kg of TGX every other day through intraperitoneal injection. DMSO serves as the control. Excess of Bliss (EOB) was calculated based on a Bliss Independence model (See STAR methods for detail). The average of EOB (EOB<sub>ave</sub>) was derived from EOBS of each time point. Error bars are standard deviations derived from three to four independent replicates or standard errors of 5–8 tumors. Student's t test or One-Way ANOVA was used to determine p values. ns: not significant.

mice treated with TGX or TGX/TMZ remained unchanged 11 days after 2-week treatment, indicating no growth of tumors, whereas TMZ-treated tumors continued to grow. This mimics the clinical progression of therapy-resistant GBMs after chemotherapy. Drug interaction analyses showed that TGX/TMZ exhibited a synergistic effect during and after treatments with an average of EOB (EOB<sub>ave</sub>) of 18.5%. Collectively, our results have demonstrated that PI3K $\beta$  inhibition synergizes with TMZ to block the growth of PI3K $\beta$ -high MGMT-deficient GBMs.

### PI3K $\beta$ inhibitors overcome TMZ resistance in PI3K $\beta$ -high GSCs

Prior research has found that a small population of GBM cells, named GSCs, is expected to be more resistant to TMZ than differentiated GBM cells.<sup>55,56</sup> Our laboratory has isolated some PI3K $\beta$ -high GSC lines from patient specimens.<sup>30,57</sup> To test if PI3K $\beta$  inhibition could have the same cytotoxicity as GSCs, we treated PI3K $\beta$ -high VTC-103/GSCs, PI3K $\beta$ -low VTC-056/GSCs, and neural stem cells (NSC) with a combination of TMZ and PI3K $\beta$  inhibitors. Here, we employed the sphere-forming assay to evaluate GSCs' ability to self-renew. We found that 100  $\mu$ M TMZ (white bars) had no effect on GSCs' self-renewal regardless of levels of PI3K $\beta$  (Figures 6A and 6B), proving the TMZ resistance in GSCs. Unexpectedly, 20  $\mu$ M TGX remarkably suppressed the self-renewal of VTC-103/GSCs (Figure 6A) and NSCs (Figure 6C) with no effect

**Figure 6. PI3K $\beta$  inhibitors overcome TMZ resistance in PI3K $\beta$ -high GSCs**

The sphere-forming assay was used to measure the self-renewal of PI3K $\beta$ -high VTV103/GSC (A), PI3K $\beta$ -low VTC-056/GSC (B), or NSC (C). Cells were treated with 20  $\mu$ M TGX-221 (TGX), 10  $\mu$ M AZD6482 (AZD), or 100  $\mu$ M TMZ, as well as combinations of TGX/TMZ or AZD/TMZ. Cells were imaged using an inverted microscope. Single or sick cells were indicated by red arrows. Wells with healthy spheres were scored, and percentages of wells with spheres (numbers of wells with spheres/numbers of all wells in each treatment group) were plotted. EOBS were calculated using the Bliss Independence model. Error bars stand for standard deviations derived from three to four independent replicates. Student's t test was used to determine p values between two groups. ns: not significant. Scale bar: 50  $\mu$ m.

on that of VTC-056/GSCs (Figure 6B) and this cytotoxic effect was exacerbated upon a combination of TMZ (EOBs = 8.3% in VTC-103/GSC and 2.1% in NSCs). Because VTC-103/GSCs and NSCs were overly sensitive to TGX, it would be difficult to measure drug synergy. To resolve this issue, we treated cells with a different PI3K $\beta$  inhibitor, AZD6482 (AZD,<sup>58</sup>). Unlike TGX, 10  $\mu$ M AZD by itself had no limited effect on three cell lines (burnt sienna bars) but yielded a synergistic effect together with TMZ exclusively in VTC103/GSC (EOB = 79.2%) with no drug effect on VTC-056/GSC (EOB = 0%) or NSCs (EOB = -0.08%). These results together have demonstrated a crucial role of PI3K $\beta$  in regulating chemo-resistance in GSCs.

## DISCUSSION

GBM accounts for nearly half of all primary brain tumors, but patients continue to exhibit poor clinical outcomes.<sup>1</sup> Although many drugs have entered GBM clinical trials, none have shown better antitumoral effects than TMZ, the standard GBM treatment since its approval in March 2005. The combination of TMZ and other treatments, such as radiation, improves median survival and quality of life.<sup>4,11,59,60</sup> However, the

benefits of TMZ treatment remain palliative due to the inevitable development of TMZ resistance. It is, therefore, imperative to better understand the mechanisms underlying TMZ resistance to maximize TMZ's efficacy for GBM. In this report, we have found that not only is PIK3CB/PI3K $\beta$  expressed at the highest level among the four PI3K kinases in primary MGMT-deficient GBMs, but its mRNA levels are also associated with levels of PI3K activation, levels of TMZ sensitivity, as well as GBMs' clinical outcomes. Moreover, PI3K $\beta$  prevails in activating PI3K and inducing chemoresistance over other PI3K kinases in MGMT-deficient GBMs, including GSCs. Our results collectively have demonstrated that selective activation of PIK3CB/PI3K $\beta$  is a dominant mechanism by which MGMT-deficient GBMs develop TMZ resistance; as such, selective blockade of PIK3CB/PI3K $\beta$  is a preferable therapeutic approach to circumventing chemoresistance.

The PI3K signaling appears to be a common denominator in TMZ resistance; however, the most effective strategy for achieving pathway inhibition is crucial but challenging to identify, given the divergent roles of PI3K kinases in cancers.<sup>18</sup> Class I PI3K kinases are most implicated in GBM, given their dominant roles in regulating pathway activity. Research presented in this report has focused on class IA subunits because we have previously shown that the class IB subunit is minimally expressed in GBM.<sup>30</sup> PIK3CA is a commonly mutated gene across all cancers, but mutation rates are variable and generally low in GBM.<sup>61–64</sup> Genetic ablation of PIK3CA and other PI3K genes does show cytotoxicity to GBM.<sup>28,65</sup> However, the high toxicity profile and low efficacy of PIK3CA/PI3K $\alpha$  inhibitors in the clinic have made this kinase not an appealing drug target for GBM.<sup>66</sup> For instance, while PIK3CA/PI3K $\alpha$  and PIK3CB/PI3K $\beta$  are both widely expressed in almost all tissues including pancreas and PIK3CD/PI3K $\delta$  and PIK3CG/PI3K $\gamma$  are almost exclusively expressed in immune cells,<sup>18</sup> it is PIK3CA/PI3K $\alpha$ , but not other PI3K isoforms, activates insulin signaling and controls glucose metabolism<sup>67</sup>; as such, hyperglycemia is the most common side effect caused by the blockade of PIK3CA/PI3K $\alpha$  in human patients, which has significantly narrowed the therapeutic window of PIK3CA/PI3K $\alpha$  inhibitors.<sup>66</sup> In line with our observation that astrocytes are sensitive to the PI3K $\alpha$  inhibitor BYL719, which suggests that inhibiting PIK3CA/PI3K $\alpha$  could yield significant toxicity to the normal brain, PIK3CA/PI3K $\alpha$  is not the first therapeutic choice for brain malignancy. The role of PIK3CD/PI3K $\delta$  and PIK3CG/PI3K $\gamma$  in GBM has not yet been extensively studied, possibly because they are mainly involved in hematopoietic disorders.<sup>68,69</sup> Targeting PIK3CD/PI3K $\delta$  and/or PIK3CG/PI3K $\gamma$  is also not good choice for GBM given the potential toxicity to immune systems and our results shown in this study that CAL101 (PI3K $\delta$  inhibitor) or CZC24832 (PI3K $\gamma$  inhibitor) exhibited no or limited effect on GBMs. Of the four PI3K kinases, PIK3CB/PI3K $\beta$  is most strongly correlated with GBM survival and recurrence, more specifically regulates AKT activation, proves the most significant and consistent cytotoxicity to GBMs, and reduces cell migration to suppress tumor invasiveness.<sup>30,43,44,58,70–76</sup> Results from these studies are not only congruent with our finding that PIK3CB/PI3K $\beta$  is a selective survival factor for GBM<sup>30</sup> but also supply a staunch support to the conclusion derived from this report that PIK3CB/PI3K $\beta$  is a preferred drug target for overcoming GBM's chemoresistance.

It is still not fully understood why PI3K kinases show divergent functional activities despite significant structural homology. Past research has suggested that the functional divergence among PI3K kinases stems from their different affinities to cell membrane receptors. For instance, PIK3CA/PI3K $\alpha$ , PIK3CB/PI3K $\beta$ , or PIK3CD/PI3K $\delta$  can interact with RTKs to activate PI3K signaling, while only PIK3CB/PI3K $\beta$  or PIK3CG/PI3K $\gamma$  can signal through G-protein coupled receptors.<sup>18,73</sup> This explains the unique and dominant activity of PIK3CB/PI3K $\beta$  in GBM and other cancers. Recent research has also revealed that PIK3CB/PI3K $\beta$  is structurally different from other wild-type PI3K kinases, making PIK3CB/PI3K $\beta$  more tumorigenic. For example, wild-type PI3K $\beta$  and mutated PI3K $\alpha$  (PI3K $\alpha$ <sup>E542K</sup>, PI3K $\alpha$ <sup>E545K</sup>, or PI3K $\alpha$ <sup>H1047R</sup>), but not wild-type PI3K $\alpha$ , activate PI3K and transform chicken embryo fibroblasts<sup>77</sup> or human mammary epithelial cells.<sup>78,79</sup> Deletion of PI3K $\beta$ , but not PI3K $\alpha$ , inhibits the formation of PTEN-deficient prostate cancer,<sup>80</sup> colon cancer,<sup>44</sup> and brain cancer.<sup>30,44,73</sup> Consistently, both wild-type PI3K $\beta$  and oncogenic PI3K $\alpha$ <sup>N345K</sup> can transform NIH3T3 cells.<sup>81</sup> However, further studies are needed to characterize structural differences among these PI3K kinases to understand how they function distinctly at atomic levels.

Another gene in close association with the PI3K/AKT pathway that exerts a significant regulatory role is PTEN. PTEN antagonizes the enzymatic reaction of PI3K kinases by dephosphorylating PIP3 into PIP2, thereby inhibiting PI3K/AKT pathway activation. PTEN is the most mutated PI3K gene in GBM,<sup>15,16</sup> undergoing inactivating mutations that contribute heavily to aberrant PI3K/AKT activation and TMZ resistance.<sup>82–85</sup> While PTEN inactivation fails to dephosphorylate PIP3, the full activation of PI3K signaling still requires a PI3K kinase. It is therefore possible that PIK3CB/PI3K $\beta$  could synergize with PTEN loss to fully activate PI3K. Consistent with this idea, PIK3CB/PI3K $\beta$  has been found in driving the tumor growth and proliferation in PTEN-deficient GBMs while playing a lesser role when PTEN function is intact.<sup>43,44</sup> However, contradictory to this idea, we and others have shown that PTEN levels in GBM patients have no correlations with GBM's prognosis, particularly in the setting of chemo treatments and tumor recurrence.<sup>30,86</sup> We have shown herein that PI3K $\beta$  blockade inactivated PI3K and restored TMZ sensitivity in PTEN-null/PI3K $\beta$ -high SF295 and U87MG cells,<sup>87</sup> but failed to do so in both PTEN-positive/PI3K $\beta$ -low LN229<sup>88</sup> and PTEN-null A172/PI3K $\beta$ -low A172 cells.<sup>30,31,89</sup> Our current study has therefore verified that PTEN or PTEN mutations are dispensable in predicting PI3K activation and TMZ sensitivity at least in a subset of GBMs.

DNA repair mechanisms such as MGMT, mismatch repair, and base excision repair are the most recognized sources of MGMT-dependent or -independent TMZ resistance; however, many molecular pathways also mediate TMZ resistance. One such mediator is the epidermal growth factor receptor (EGFR), which is amplified in a majority of GBM tumors.<sup>90,91</sup> Unfortunately, inhibitors of EGFR are highly susceptible to drug resistance because approximately half of amplified EGFR in GBM is of a constitutively activated mutant form EGFR $\text{vIII}$  unresponsive to competitive inhibition.<sup>92,93</sup> Downstream effectors of EGFR, namely PI3K and its effector AKTs, are thus more efficacious targets as they circumvent such activating mutations. Indeed, PI3K pathway activation is tied to many mediators of TMZ resistance, making it the ideal candidate to mitigate TMZ resistance. For example, PI3K/AKT stabilizes hypoxia-inducible factor 1, which causes increased expression of forkhead box protein M1 that reinforces angiogenesis in TMZ-resistant GBMs.<sup>94,95</sup> PI3K/AKT also activates nuclear factor kappa B, leading to increased transcription of MGMT expression and TMZ resistance,<sup>96</sup> or forkhead O transcription factors that cause disequilibrium of apoptotic proteins

to promote the escape of GBM cells from chemotherapeutics-induced cytotoxicity.<sup>97</sup> Moreover, inhibition of PI3K/AKT downstream targets mTOR, JAK/STAT, or B-cell lymphoma 2 activates autophagy and overcomes TMZ resistance.<sup>98–101</sup> In this report, we have found that three AKT isoforms have different activities downstream of PI3K $\beta$ , with AKT1 and AKT3 being the effector kinases involved in TMZ resistance. Our results are consistent with the work from other groups in which they have found that knockdown of AKT1 or AKT3 increases chemosensitivity<sup>28,54</sup> and reinforced expression of AKT3 promotes DNA repair and TMZ resistance.<sup>52</sup> However, other reports also suggest the involvement of AKT2 in TMZ resistance.<sup>102,103</sup> Moving forward, it is essential to further investigate how PIK3CB/PI3K $\beta$  activates its downstream effector proteins to induce chemoresistance in GBM and how to selectively target this PI3K kinase to circumvent GBM's chemoresistance.

Blocking PI3K signaling by non-selectively inactivating all PI3K kinases has been proven ineffective in the clinic because it yields severe side effects,<sup>22–25</sup> which has substantially hindered the translation of PI3K-based therapies. Such a clinical challenge has prompted an extensive investigation of PI3K isoform-selective functions in various types of cancer including GBM.<sup>26–31</sup> We have previously shown that certain GBMs depend on PIK3CB/PI3K $\beta$ , but not other isoforms, to survive and grow and that, in a stark contrast, PIK3CB/PI3K $\beta$  is dispensable to normal astrocytes.<sup>30,31</sup> Congruent with these results, our work presented in this study has furthered our understanding of PIK3CB/PI3K $\beta$  in TMZ resistance independent of MGMT and added more weight on choosing PIK3CB/PI3K $\beta$  as the prime drug target for difficult-to-treat GBMs. Furthermore, our results have suggested that a subset of MGMT-deficient GBMs expressing high levels of PI3K $\beta$  would benefit from PI3K $\beta$ -based therapies; hence, a preselection of GBMs with methylated MGMT promoters and high levels PIK3CB mRNAs can be a better therapeutic strategy for clinical trials using PI3K $\beta$  drugs. This strategy can also explain the modest effect from the PI3K $\beta$ -selective inhibitor GSK2636771 in PTEN-deficient solid tumors because it is not known of these tumors express high levels of PIK3CB mRNAs.<sup>104</sup> Taken together, the research presented herein has demonstrated a strong translational potential of PI3K $\beta$  drugs as clinically applicable treatments for TMZ-resistant GBMs and perhaps other cancers that depend upon PIK3CB/PI3K $\beta$  to survive and grow.

### Limitations of the study

In this study, we have identified divergent roles of PI3K catalytic kinases in chemoresistance in GBM and found that PI3K $\beta$  serves as a key signaling point in the response of GBMs to TMZ and a prime target for overcoming TMZ resistance. While we have obtained the results in established GBM cell lines, primary GSCs derived from patients, as well as xenograft animal models, we have not yet been able to verify our key findings in orthotopic GBM mouse models that better mimic human diseases and have challenges in intracranial drug delivery. In fact, the blood-brain barrier is the major hurdle for delivering PI3K $\beta$  inhibitors into the brain and translating our findings into the clinic to help patients. Moreover, we have also not examined the complexity in PI3K activation (e.g., genetic mutations or other survival signaling working in parallel or in concert with PI3K) in the context of drug resistance in GBM patients. We will resolve these issues in our future studies.

### DECLARATION OF GENERATIVE AI AND AI-ASSISTED TECHNOLOGIES IN WRITING PROCESS

Authors declare that no generative AI or AI-assisted technologies in writing process were used in preparing this manuscript. Authors take full responsibility for the content of this publication.

### STAR★METHODS

Detailed methods are provided in the online version of this paper and include the following:

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## SUPPLEMENTAL INFORMATION

Supplemental information can be found online at <https://doi.org/10.1016/j.isci.2024.109921>.

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## AUTHOR CONTRIBUTIONS

Z.S. and K.J.P. conceptualized this study. Z.S., K.J.P., K.R.H., P.B., M.L., E.X., E.M., V.B., C.P., J.S., and L.H. made contributions to investigation/methodology. Z.S., K.R.H., and P.B. wrote manuscript. Z.S. acquired funds to support this research. Z.S., A.T., and D.F.K. curated/analyzed data and provided resources.

## DECLARATION OF INTERESTS

All authors declare that they have no conflicts of interest.

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## STAR★METHODS

### KEY RESOURCES TABLE

REAGENT or RESOURCE	SOURCE	IDENTIFIER
<b>Antibodies</b>		
Anti-phospho-AKT-S473	Cell Signaling Technology	Cat#4051; RRID:AB_331158
Anti-AKT	Cell Signaling Technology	Cat#4685; RRID:AB_2225340
Anti-phospho-AKT-T308	Cell Signaling Technology	Cat#4056; RRID:AB_331163
Anti-p110 $\alpha$	Cell Signaling Technology	Cat#4249; RRID:AB_2165248
Anti-p110 $\beta$	Cell Signaling Technology	Cat#3011; RRID:AB_2165246
Anti- $\beta$ -actin	Millipore-Sigma	Cat#A3854; RRID:AB_262011
<b>Chemicals, peptides, and recombinant proteins</b>		
Human FGF-basic (FGF-2/bFGF) (154 aa)	Thermo Fisher Scientific	Cat#AF-100-18B-1MG
Animal-Free Recombinant Protein PeproTech®		
Human EGF, Animal-Free Recombinant Protein, PeproTech®	Thermo Fisher Scientific	Cat#AF-100-15-1MG
AZD6482	AdooQ Bioscience	Cat#A10112
BKM120	AdooQ Bioscience	Cat#A11016
CAL101	AdooQ Bioscience	Cat#A10172
CZC24832	AdooQ Bioscience	Cat#A11363
TGX-221	AdooQ Bioscience	Cat#A10923
BYL719	AdooQ Bioscience	Cat#A11328
Temozolomide	AbMole BioScience	Cat#M2129
Dimethyl sulfoxide	Millipore Sigma	Cat#41639
Puromycin dihydrochloride from Streptomyces alboniger	Millipore Sigma	Cat#P8833
Blasticidin S HCl	Thermo Fisher Scientific	Cat#A1113903
<b>Critical commercial assays</b>		
Effectene Transfection Reagent	QIAGEN	Cat#301425
CellTiter 96® AQueous One Solution Cell Proliferation Assay (MTS)	Promega	Cat#G3582
SuperSignal™ West Pico PLUS Chemiluminescent Substrate	Thermo Fisher Scientific	Cat#34580
SuperSignal™ West Femto Maximum Sensitivity Substrate	Thermo Fisher Scientific	Cat#34096
High Concentration Corning Matrigel Matrix	Corning	Cat#354248
<b>Experimental models: Cell lines</b>		
U87MG	ATCC	Cat#HTB-14; RRID:CVCL_XZ66
SF295	Millipore Sigma	Cat#SCC289; RRID:CVCL_1690
LN229	ATCC	Cat#CRL-2611; RRID:CVCL_0393
A172	ATCC	Cat#CRL-1620; RRID:CVCL_0131
NHA human astrocytes	Lonza	Cat#cc-2565
HEK293T	ATCC	Cat#CRL-3216; RRID:CVCL_0063
<b>Experimental models: Organisms/strains</b>		
Scid/Beige (C.B-Igh-1b/GbmsTac-Prkdcscid-Lystbg N7)	Taconic Biosciences	Cat#CBSCBG-F; RRID:IMSR_TAC:CBSCBG
<b>Software, algorithms, and public datasets</b>		
The Cancer Dependency Map	<a href="https://depmap.org">https://depmap.org</a>	22Q1; Protein_Array; Proteomics; drug_sensitivity
The Cancer Gene Atlas	<a href="https://www.cbiportal.org">https://www.cbiportal.org</a>	gbm_tcga
The China Glioma Gene Atlas	<a href="http://www.cgga.org.cn/download.jsp">http://www.cgga.org.cn/download.jsp</a>	mRNAseq_693

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**Continued**

REAGENT or RESOURCE	SOURCE	IDENTIFIER
The Genotype-Tissue Expression	<a href="https://gtexportal.org">https://gtexportal.org</a>	gene_tpm_brain_cortex
The Human Protein Atlas	<a href="https://www.proteinatlas.org">https://www.proteinatlas.org</a>	Glioma
<b>Plasmids</b>		
pBABE-Myr-AKT1	Addgene	Cat#15266
pBABE-Myr-AKT2	Addgene	Cat#9018
pBABE-Myr-AKT3	Addgene	Cat#9019
PIK3CA gRNA	Addgene	Cat#77415
PIK3CB gRNA	Addgene	Cat#76191
PIK3CB gRNA	Addgene	Cat#76192
pLenti-Cas9-Blast	Addgene	Cat#52962
psPAX2	Addgene	Cat#12260
pMD2.G	Addgene	Cat#12259
PIK3CA shRNA RHS4844-101656239	Horizon Discovery	Cat#RHS4012
PIK3CB shRNA RHS4884-1016565350	Horizon Discovery	Cat#RHS4012
PIK3CD shRNA RHS4884-101655755	Horizon Discovery	Cat#RHS4012
<b>Other</b>		
Dulbecco's Modified Eagle Medium	Thermo Fisher Scientific	Cat#12100061
EqualFETALTM bovine serum	Atlas Biologicals	Cat#EF-0500-A
Streptomycin & penicillin, Gibco®	Thermo Fisher Scientific	Cat#15140163
Trypsin-EDTA	Santa Cruz Biotechnology	Cat#sc-363354
AGM™ Astrocyte Growth Medium	Lonza	Cat#cc-3138
Fetal Bovine Serum	Atlas Biologicals	Cat#F-0500-A
MEM Non-Essential Amino Acids Solution	Thermo Fisher Scientific	Cat#11140050
B-27™ Supplement, Gibco®	Thermo Fisher Scientific	Cat#17504001
TrypLE™ Express Enzyme	Thermo Fisher Scientific	Cat#12605010

**RESOURCE AVAILABILITY****Lead contact**

Further information and requests for resources and reagents should be directed to and will be fulfilled by the lead contact, Zhi Sheng (zhisheng@vtc.vt.edu).

**Materials availability**

This study did not generate any new reagents.

**Data and code availability**

This paper analyzes publicly available data from TCGA or DepMap databases. Information regarding datasets analyzed in this study are listed in the [key resources table](#). This study did not report any 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****Cell lines**

In this study, four cell lines U87MG, SF295, LN229, and A172 were purchased from and authenticated by ATCC or Millipore Sigma. The authentication essay was used to identify short tandem repeat (STR) markers. Cell lines were also tested for mycoplasma contamination using the ATCC universal mycoplasma detection kit. The U87MG cell line was derived from malignant gliomas of a male patient. The SF295 cell line was derived from GBM of a female patient. The LN229 cell line was derived from GBM of a female patient. The A172 cell line was derived from GBM of a male patient. All cell lines were cultured as described previously.<sup>29,30,57,105</sup> Cells were maintained in the Dulbecco's Modified Eagle Medium supplemented with 10% EqualFETALTM bovine serum, 100 mg/mL streptomycin and 100 IU/mL penicillin. The human astrocyte cell line NHA was purchased from Lonza. NHA cells were cultured in Astrocyte Growth Media having 10% fetal bovine serum, 100 mg/mL

streptomycin, 100 IU/mL penicillin, and 0.1 mM MEM nonessential amino acid. When passaging cells, cells were treated with 0.05% Trypsin-EDTA for 2 to 5 min and resuspended in the culture media. After cell counting using a hemacytometer,  $\sim 3-5 \times 10^5$  cells were plated in a new 10-cm dish. Detailed information regarding cell lines and culturing reagents can be found in the [key resources table](#).

### Primary cultures

VTC-103/GSCs or VTC-056/GSCs were derived from human GBM specimens in the Sheng lab previously.<sup>30,57</sup> These human patient specimens were from the Department of Neurosurgery of Carilion Clinic. Because the patient information was recorded by Carilion Clinic and not available to the Sheng lab, sex of these two primary cell lines cannot be reported herein. GBM stem cells were cultured as described previously.<sup>30,57</sup> Culture media for GBM stem cells include Dulbecco's Modified Eagle Medium supplemented with 50X Gibco<sup>®</sup> B-27<sup>®</sup> supplement, 20 ng/mL FGF-2, and 20 ng/mL EGF. GBM stem cells grew as spheres slowly and media were changed weekly. To passage GBM stem cells, spheres were dissociated into single cells by incubating spheres in TrypLE Express Enzyme for 5 to 10 min. After cell counting,  $\sim 3-5 \times 10^5$  single stem cells were plated in a T-25 flask.

### In vivo animal models

Animal experiments were approved by the Institutional Animal Care and Use Committee of Virginia Tech. This study used 6–8 weeks old female SCID/beige mice purchased from Taconic Bioscience. The nomenclature of this strain is C.B-Igh-1b/GbmsTac-Prkdc<sup>scid</sup>-Lyst<sup>bg</sup> N7. The genotype is sp/sp; sp/sp. Since our studies did not focus on difference in gender, we used female mice because they were less aggressive when performing cell injections and drug treatments. For drug treatment, mice were randomly allocated into two groups and each group had two to three cages. Detailed information can be found in the [key resources table](#).

## METHOD DETAILS

### Reagent preparation

Most chemicals listed in the [key resources table](#) were reconstituted in dimethyl sulfoxide (DMSO) at a concentration of 50–80 mM. Puromycin was dissolved in sterile water at a concentration of 5 mg/mL. All chemicals were aliquoted (to avoid repeated freeze/thaw cycles that decrease drug activity) and stored at –80° based on our previously published work.<sup>29</sup> We previously purchased a TRC kinase shRNA library from Thermo Fisher Scientific, which was discontinued recently. However, the entire library of human shRNAs or individual shRNAs are available at Horizon Discovery. Other plasmids listed in the [key resources table](#) were purchased from Addgene. All plasmids were built on lenti- or retro-virus backbone. They were used to generate viruses together with the packaging plasmids psPAX2 and pMD2.G in HEK293T cells. These viruses were aliquoted and stored at –80 freezer and subsequently used to infect cells and transfer DNAs of interest into GBM cells, as described previously.<sup>29</sup>

### Analyses of online databases

Analysis of online databases has been described previously.<sup>29,30,106</sup> Datasets of RNA sequencing, immunohistochemical staining, and drug treatments were downloaded from the following databases: (1) The Cancer Dependency Map: <https://depmap.org>; (2) The Cancer Gene Atlas datasets: <https://www.cbiportal.org>; (3) The Genotype-Tissue Expression: <https://gtexportal.org>; (4) The China Glioma Gene Atlas datasets: <http://www.cgga.org.cn/download.jsp>. Details can be found in the [key resources table](#). The Kaplan-Meier survival analysis and the Cox hazard proportional model were used to acquire hazard ratios, which indicate the risk level of death based on gene expression levels. These analyses were performed using the JMP software. The Pearson correlation coefficient, calculated using Prism 9 software, was used to determine the expression correlation between different genes/proteins and correlations between gene levels and TMZ's sensitivity quantified as IC50s.

### Image analyses

The immunohistochemically stained images were downloaded from The Human Protein Atlas: <https://www.proteinatlas.org>. Four persons independently quantified immunohistochemically stained images retrieved from The Human Protein Atlas using the ImageJ software. For each image, each person randomly selected 10 different visible cells and measured the intensities of proteins inside cells. 10 intensity readings were averaged to acquire relative protein staining intensities. Measurements from four persons' experiments were considered as individual data points, where standard errors or standard deviations were derived.

### Gene knockout or knockdown

To knock out genes using CRISPR-Cas9 or knock down genes using shRNA, plasmids encoding Cas9, gRNAs, or shRNAs were transfected together with plasmids encoding virus-packaging proteins into HEK293T cells using Effectene. Viral supernatants were collected to infect GBM cells. For CRISPR-Cas9 knockout, GBM cells were selected using blasticidin (5 µg/mL for Cas9 expression) and puromycin (0.5 µg/mL for gRNA expression) for 5 to 7 days. For shRNA knockdown, GBM cells were selected by 0.5 µg/mL puromycin for 7–10 days. Transduced cells were collected for immunoblotting of PI3Kα or PI3Kβ to ensure gene knockout or knockdown or used for drug combination analyses. Details regarding these reagents can be found in the [key resources table](#).

### Drug treatment and analyses

To treat cells with single drug or drug combinations, 500 to 2,000 GBM cells were plated into a well of 96-well plates. The next day, media were replaced with drug-containing media, which were prepared from drugs at stock concentrations (usually ~1,000-fold of working concentrations). For TMZ dose-dependent effect, TMZ at different concentrations (0, 25, 50, 100, 200, 400  $\mu$ M) was added to cells. DMSO was used as the vehicle control. After 4-day treatment, cell viability was measured using the MTS viability assay as described below. Prism 10 software was used to calculate the half-maximal inhibitory concentration (IC<sub>50</sub>s) of TMZ. To calculate drug constructive interaction, a Bliss Independence model was used as described previously.<sup>29</sup> The predicted cytotoxic effect for dual therapies was calculated using Effect<sub>(a+b)</sub> = Effect<sub>a</sub>+Effect<sub>b</sub>-Effect<sub>a</sub>Effect<sub>b</sub>. The overall cytotoxic synergistic effect was presented as Excess Over Bliss (EOB) scores. EOB >0% shows a synergistic effect, while EOB = 0% shows an additive effect, and EOB <0% shows an antagonistic effect. For animal experiments described below, EOB was calculated based on the results of each time point. EOB<sub>ave</sub> was the average of EOBs from all time points after cell injections.

### MTS viability assay

Cell viability was measured using the MTS cell viability assay as described previously.<sup>29,30,107</sup> After drug treatment, CellTiter 96 AQueous One Solution Cell Proliferation Assay (MTS, Promega) was added to cells and incubated in the dark for 2 h. The absorbance at 490 nm was measured using a FilterMax F3 microplate reader (Molecular Devices). After subtracting 490 nm absorbances of experimental wells with those of blank wells, normalized absorbances of treatment groups were divided by absorbances of respective vehicle control groups, yielding percentages of viability. Error bars are standard deviations from three to four independent replicates.

### Sphere-forming assay

A sphere-forming assay was done as previously described.<sup>57</sup> ~50–100 GBM stem cells or neural stem cells were plated in a well of 96-well plate. Cells were treated with single agents or combinations, as shown in the figure. Each treatment group had 8 wells. After 4-day treatment, wells with spheres (a spheroid culture that is > 3-fold larger than a single cell) were scored. Images of representative spheres were taken using an inverted microscope. Percentages of wells with spheres in each treatment group were calculated by dividing the number of wells with spheres by the number of wells in each treatment group. Error bars stand for standard deviations from three to four independent replicates.

### Immunoblotting

Immunoblotting was done as described previously.<sup>29,30,107</sup> In brief, more than  $5 \times 10^6$  cells were lysed in 50–100  $\mu$ L of cell lysis buffer including 20 mM HEPES pH 6.8, 140 mM NaCl, 2.5 mM MgCl<sub>2</sub>, 2.5 mM CaCl<sub>2</sub>, 1% NP40, 0.5% sodium deoxycholate, protease inhibitor, and phosphatase inhibitors. Cell lysates were collected by centrifugation and concentrations of total proteins were quantified using Coomassie blue staining. 25 to 50  $\mu$ g total proteins were resolved and separated on SDS-PAGE gels and transferred onto PVDF membranes. Antibodies were purchased from Cell Signaling Technology or from Millipore-Sigma (See the [key resources table](#)). Dilution rates of antibodies were 1:1,000 (Anti-PI3K $\alpha$ , Anti-PI3K $\beta$ , Anti-phospho-AKT-S473, Anti-phospho-AKT-T308, Anti-AKT) or 1:5,000 (Anti- $\beta$ -actin). Images of chemiluminescence from SuperSignal West Pico or Femto substrates (Thermo Fisher Scientific) were taken using the ChemiDoc MP (BioRad). Images were analyzed using Image Lab (BioRad). Exported images were further cropped in Adobe PhotoShop.

### Xenograft mouse models

Animal experiments were done based on previously published work<sup>29,30</sup> and were approved by the Institutional Animal Care and Use Committee of Virginia Tech.  $2 \times 10^6$  cells were premixed with Matrigel Matrix in a cold room and subcutaneously injected into 8 weeks old SCID/beige mice (referring the [key resources table](#) for details). 11 days after cell injection, 6 to 8 mice were randomized into different treatment groups. The sample size was determined based on power analysis using G\*Power. Mice were treated with individual drugs (TMZ or TGX-221) or drug combinations (TMZ and TGX-221) at doses shown in the figure. Drugs were delivered using intraperitoneal injection. Tumors were measured every other day using a digital caliper. The endpoints set for animal experiments are, if mice who are significantly ill or with 10% weight loss, they will be excluded from the experiment. In the experiment presented in this study, no mice were excluded based on these endpoints. After 14-day treatment, tumor growth was monitored for 11 more days. On day 35 post-cell infection, mice were euthanized. Tumor volumes ( $\text{mm}^3$ ) were acquired using the formula (length x width<sup>2</sup>)/2.

## QUANTIFICATION AND STATISTICAL ANALYSIS

The distribution and variation of data points in each experiment were analyzed and estimated. Three to four independent experiments were performed in cell-based assays, yielding standard deviations shown as error bars. Drug combinations were repeated in different cell lines. One-way ANOVA with Dunnett test for correction of multiple comparisons, Fisher's exact test, and Student's t test were used to determine statistical significance and similarity of variance. All tests were two-sided. The center values shown in each figure were means. Details regarding statistical analyses were also provided in Figure Legends where appropriate.