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## Low-grade astrocytoma mutations in IDH1, P53 and ATRX cooperate to block differentiation of human neural stem cells via repression of SOX2

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### AUTHOR CONTRIBUTIONS

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Supplemental File Set: RNA-seq clusters, Related to Figure 4

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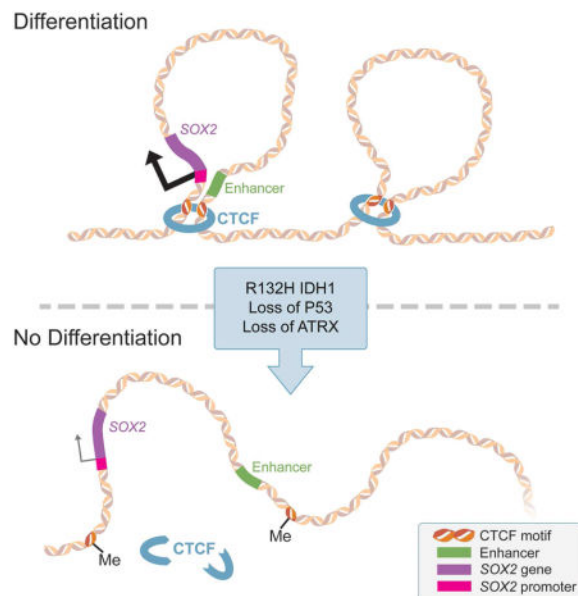
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## SUMMARY

Low-grade astrocytomas (LGA) carry neomorphic mutations in Isocitrate Dehydrogenase (IDH), concurrently with P53 and ATRX loss. To model LGA formation, we introduced R132H IDH1, P53 shRNA and ATRX shRNA in human neural stem cells (NSCs). These oncogenic hits blocked NSC differentiation, increased invasiveness *in vivo* and led to a DNA methylation and transcriptional profile resembling IDH1-mutant human LGAs. The differentiation block was caused by transcriptional silencing of transcription factor *SOX2*, secondary to disassociation of its promoter from a putative enhancer. This occurred due to reduced binding of the chromatin organizer CTCF to its DNA motifs and disrupted chromatin looping. Our human model of IDH-mutant LGA formation implicates impaired NSC differentiation due to repression of *SOX2* as an early driver of gliomagenesis.

## Graphical abstract



## Keywords

Low-grade glioma; astrocytoma; IDH; P53; ATRX; neural stem cells; SOX2; chromatin looping; CTCF; DNA methylation

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## INTRODUCTION

Diffuse low-grade gliomas (LGGs) are slow-growing (WHO grade II) brain tumors that occur in early adult life (Cancer Genome Atlas Research et al., 2015; Ceccarelli et al., 2016) and progress to high-grade gliomas. Current treatments for LGG are ineffective and often induce hypermutated recurrent tumors (Johnson et al., 2014), highlighting the need for improved understanding of LGG biology. LGGs are classified as astrocytomas and oligodendrogliomas. The single most prevalent genetic change in either type is mutation in the Isocitrate Dehydrogenase (IDH) gene family (Parsons et al., 2008; Yan et al., 2009). Among IDH-mutated LGGs, astrocytomas carry concurrent P53 and chromatin remodeler ATRX loss-of-function mutations, while oligodendrogliomas carry 1p/19q co-deletion and *TERT* promoter mutations (Cancer Genome Atlas Research et al., 2015). The presence of mutant IDH in two divergent tumor lineages suggests it is a common genetic driver that occurs early in a multipotent progenitor cell (Bardella et al., 2016; Pirozzi et al., 2017; Tirosh et al., 2016; Venteicher et al., 2017).

IDH normally converts isocitrate to  $\alpha$ -ketoglutarate ( $\alpha$ KG). Heterozygous neomorphic mutations in the catalytic site of IDH (R132H in the cytosolic isoform IDH1) result in production of the oncometabolite 2-hydroxyglutarate (2HG) (Dang et al., 2009). 2HG competitively inhibits  $\alpha$ KG-dependent dioxygenases responsible for demethylation of DNA and histones (Xu et al., 2011). DNA methylation and histone modifications dynamically shape the epigenome, which we define as heritable transcriptional states determined by means other than changes in the DNA sequence. Inhibition of DNA and histone demethylation by 2HG leads to a hypermethylated epigenetic state, which may cause dysregulation of oncogenes and tumor suppressors (Figuroa et al., 2010; Lu et al., 2012; Turcan et al., 2012). Flavahan et al. (2016) postulated that hypermethylation may disrupt the binding of methylation-sensitive chromatin organizer CTCF, leading to chromatin disorganization and aberrant expression of oncogenes in IDH-mutated high-grade gliomas. Other groups have linked the accumulation of 2HG and epigenetic hypermethylation to a block in differentiation, which predisposes to oncogenesis (Figuroa et al., 2010; Lu et al., 2012; Saha et al., 2014; Turcan et al., 2012). Recent mouse models have suggested that expression of mutant IDH1 in progenitors of the subventricular zone (SVZ) may induce a pre-tumorigenic state (Bardella et al., 2016; Pirozzi et al., 2017; Sasaki et al., 2012). The mechanism whereby the IDH1 mutation cooperates with loss of P53 and ATRX to promote LGA formation remains unknown.

We modeled mutant IDH1 LGA formation in neural stem cells (NSCs) derived from human embryonic stem cells (hESCs). We systematically introduced the 3 core genetic changes found in LGA via lentiviral expression of R132H mutant IDH1, and short hairpin RNA (shRNA)-mediated knockdown of P53 and ATRX, in order to study progression of

gliomagenesis on an oncogenic hit-by-hit basis. We show that the combination of 3 hits blocks NSC differentiation and evokes brain invasiveness. The differentiation block is caused by transcriptional downregulation of transcription factor SOX2, the master regulator of NSC multipotency. The etiology of this transcriptional silencing is disrupted chromatin looping due to hypermethylation of DNA binding sites for chromatin insulator CTCF, leading to disassociation of the *SOX2* promoter from critical enhancer elements.

## RESULTS

### Generation of human NSCs with astrocytoma mutations

We generated neural progenitor lineages from hESCs modified with a *HES5::GFP* bacterial artificial chromosome (BAC) reporter (Placantonakis et al., 2009) (Figure 1A, S1A). This reporter identifies early neuroepithelial multipotent precursors termed rosettes, in which activation of Notch signaling results in transcription of the *HES5* gene. Human ESC colonies were differentiated into *HES5::GFP*<sup>+</sup> rosette-NSCs (Edri et al., 2015; Elkabetz et al., 2008) (Figure 1A, S1A–C), which were mechanically picked and further differentiated into monolayers of EGF/FGF2-responsive NSCs (Figure 1A, S2). Such NSCs are thought to resemble adult SVZ neural progenitors in the adult SVZ, which we hypothesize are the cell of origin in LGA (Bardella et al., 2016). These NSCs are enriched for Nestin (~90% positive), lose *HES5::GFP* expression (Edri et al., 2015) and are multipotent, as demonstrated by directed differentiation to all three arms of the neuroglial lineage: neurons, oligodendrocytes and astrocytes (Figure S2A–E) (Elkabetz et al., 2008; Tabar et al., 2005).

To test how mutant IDH1 and loss of P53 and ATRX work together to promote gliomagenesis, we serially introduced an IDH1-mCherry fusion gene (R132H or wild-type or mCherry alone) into NSCs via lentivirus (Figure 1B,C), generated a pure population by FACS isolation, and added lentiviral shRNA against P53, followed by shRNA against ATRX (Figure 1B,C). We focused on conditions that are most biologically relevant: vector only (“vector”), mutant IDH1 alone (“1-hit”), mutant IDH1 with P53 knock-down (“2-hits”) and mutant IDH1 with P53 and ATRX knockdown (“3-hits”). Mutant-IDH1 NSCs with ATRX knockdown in a wild-type P53 background resulted in poor cell viability (Figure 1C), which precluded subsequent P53 knockdown. Immunofluorescent microscopy, qPCR and immunoblot verified our lines were expressing IDH1-mCherry and knocking down P53 and ATRX (Figure 1D–G).

### The DNA methylome, transcriptome and karyotype of IDH-mutated NSCs resemble those of human LGA

Using mass spectrometry (MS), we found a >1000-fold increase of oncometabolite 2HG amongst all samples that contained the IDH1 mutation (Figure 2A). Elevated 2HG levels induce DNA hypermethylation in glioma (Figueroa et al., 2010; Turcan et al., 2012). To understand the roles of mutant IDH1, P53 and ATRX in our NSCs, we profiled their DNA methylomes and transcriptomes using Illumina 450k methylation arrays and RNA-seq, respectively. Global assessment of CpG sites in promoters, genes and within CpG islands showed elevated levels of methylation in all conditions that included mutant IDH1 (Figure 2B). Increased global methylation was seen across all chromosomes (Figure S3A).

Interestingly, we discovered a large number of differentially methylated CpG regions among 1-, 2- and 3-hit conditions (Figure S3B).

We compared our DNA methylation data to 270 human LGGs from the TCGA (Cancer Genome Atlas Research et al., 2015). Using supervised hierarchical clustering based on the top 5000 most variable methylation sites from TCGA samples, we found IDH-mutated LGGs clustered separately from wild-type IDH LGGs (Figure 2C). NSCs transduced with vector alone were the most dissimilar sample (orange dendrogram in Figure 2C). Mutant-IDH1 NSCs clustered with mutant-IDH1 gliomas (violet dendrogram in Figure 2C), suggesting epigenetic similarity.

To determine transcriptional similarities between our NSCs and human LGG, we used RNA-seq data from 239 TCGA patients (Cancer Genome Atlas Research et al., 2015). We analyzed RNA-seq data from our NSCs using the same pipeline employed by the TCGA. Supervised hierarchical clustering using the top 500 most variable TCGA genes resulted in four groups that closely resembled clusters identified by the TCGA: wild-type IDH gliomas; IDH mutant 1p/19q co-deleted gliomas (oligodendrogliomas); IDH mutant 1p/19q intact gliomas (astrocytomas); and a mixed group of IDH mutated gliomas (Figure 2D). 1-hit NSCs grouped with mutant-IDH1 1p/19q intact astrocytomas, while 3-hit NSCs clustered with the mixed group of mutant-IDH1 gliomas. Vector and 2-hit NSCs grouped with the wild-type IDH and mutant-IDH1 1p/19q co-deleted oligodendroglioma groups, respectively.

Given the known roles of P53 and ATRX in genomic integrity (Negrini et al., 2010; Ramamoorthy and Smith, 2015; Ritchie et al., 2008), we performed karyotype analysis (Figure S3C). 2-hit and 3-hit NSCs had abnormal nuclei (n=20 karyotypes/condition). We observed significantly elevated numbers of chromosomal fragments in 3-hit NSCs (Figure 2Ei), suggesting genomic instability, a known feature of LGGs (Cancer Genome Atlas Research et al., 2015; Cohen et al., 2015). The 3-hit culture had evidence of premature sister chromatid separation (Figure 2Eii), likely due to loss of ATRX, which also leads to Alternative Lengthening of Telomeres (ALT) (Ramamoorthy and Smith, 2015). To test whether ALT was utilized by our NSCs, we performed co-stains for two markers that co-localize in nuclei of ALT cells, PML and TRF1 (Yeager et al., 1999). We found that only 3-hit NSCs showed nuclear co-localization of the markers (Figure 2F). Collectively, these results show epigenetic, transcriptional and karyotypic similarity of 3-hit NSCs to IDH-mutant LGA.

### Effects of the 3 hits on cell cycle, cell death and brain invasion

Using *in vitro* growth assays, we found that two conditions, 1-hit and mutant IDH1 with ATRX knockdown, grew more slowly than the others (Figure 3A). This finding correlated with cell cycle alterations (Figure 3B,C). To test if apoptosis contributed to growth differences, we performed TUNEL assays (Figure 3D,E). 1-hit and mutant IDH with ATRX knockdown NSCs had significantly elevated levels of TUNEL+ cells. P53 knockdown in the 2-hit and 3-hit conditions decreased TUNEL staining to control levels. A similar pattern was observed with flow cytometric assessment of cell death marker Annexin V (Figure 3F,G, S3D). These findings indicated that decreased cellular proliferation and increased cell death caused by R132H IDH1 were rescued by P53 knockdown in the 2-hit and 3-hit conditions.

Furthermore, these experiments indicated that loss of ATRX as the second hit leads to non-viable cells.

Diffuse brain infiltration is a hallmark of LGA. To understand whether our model replicates this aspect of the disease, we generated xenografts in NOD.SCID mice by injecting cells into the frontal lobe and quantifying cellular migration from the injection site 4 weeks later (Figure 3H,I). *In vivo* xenografts of 3-hit, but not 1-, 2-hit, or vector NSCs recapitulated the diffuse invasive nature of LGA, a key clinical feature.

### 3 hits block NSC differentiation

Expression of mutant IDH1 in progenitor cells inhibits differentiation (Figueroa et al., 2010; Lu et al., 2012; Pirozzi et al., 2017; Rosiak et al., 2016; Turcan et al., 2012; Xu et al., 2011). However, the effect of combined IDH mutation and P53/ATRX loss on NSC self-renewal and differentiation is not known. Under self-renewing conditions, immunofluorescent staining of our NSCs showed expression of Nestin, a NSC marker, in >90% of cells in all groups, with no significant staining for differentiation markers GFAP (astrocytic), TUJ1 (neuronal) or NG2 (oligodendroglial) (Figure 4A). Flow cytometric staining with CD133, a surface NSC marker (Uchida et al., 2000), and CD44, a restricted glial progenitor marker (Liu et al., 2004), revealed a different trend (Figure 4B,C, S4A,B). Vector and 2-hit NSCs were CD133<sup>high</sup> and CD44<sup>low</sup>, whereas 1-hit and 3-hit NSCs became CD133<sup>low</sup> and CD44<sup>high</sup>. These findings suggested a switching stem-like phenotype with serial introduction of the core mutations.

We next subjected these cells to extreme limiting dilution assays to test their ability to clonally form spheres from single cells in self-renewing conditions (Figure 4D). The 1-hit line had mildly diminished ability to form spheres, but the addition of P53 and ATRX knockdown rescued this deficit. To look for differences in differentiation capabilities, we directed NSCs to differentiate to neurons and astrocytes (Figure 4E,F). Similar to the flow cytometry analysis, a switching phenotype emerged. While control and 2-hit NSCs were able to differentiate, 1-hit and 3-hit cells showed a near complete differentiation block.

### SOX2 is transcriptionally downregulated by the 3 hits

In order to identify transcription factors (TFs) that correlated with the differentiation phenotype, we performed RNA-seq analysis. We discovered 2,577 genes that were differentially regulated amongst all four conditions ( $\log_2FC > 2$  and  $q_{value} < 0.05$ ; FC, fold change) (Figure 4G). We performed k means clustering and visualized the results on a scaled heatmap (Figure S4C; Supplemental file titled RNA-seq clusters). Two of 15 clusters correlated with the differentiation phenotype and contained genes that were high (cluster 2) or low (cluster 8) in conditions capable of differentiation. Within these two clusters there were 291 genes and 23 candidate TFs (Figure 4H).

One of the candidates was *SOX2* (Sex Determining Region Y-Box2), which was downregulated in conditions (1- and 3-hit) that had a differentiation block. *SOX2* is a master regulator of NSC self-renewal and multipotency (Amador-Arjona et al., 2015; Ferri et al., 2004; Lodato et al., 2013). Using qRT-PCR, we confirmed *SOX2* mRNA was downregulated ~10-fold in 1-hit and 3-hit NSCs and ~5-fold in 2-hit NSCs (Figure S4D). By immunoblot



and immunofluorescence, SOX2 protein showed the same expression pattern as *SOX2* mRNA (Figure 4I,J). We noticed a similar trend with mRNA levels of *SOX1*, a closely related gene, and the pro-neuronal differentiation TFs *NEUROD1* and *NGN2*, which are maintained in a bivalent (poised) state by SOX2 (Amador-Arjona et al., 2015; Lodato et al., 2013) (Figure S4C). When compared to vector NSCs, 3-hit NSCs injected in the mouse brain showed lower SOX2 protein levels *in vivo* (Figure S5A).

To validate our observations regarding SOX2 levels, we performed immunohistochemistry (IHC) and immunofluorescence staining for SOX2 in human specimens (Supplemental Table 1). We assessed the level of SOX2 in the human cadaveric SVZ, which showed SOX2<sup>high</sup> NSCs and ependymal cells (Figure 4K, S5B,C) (Baer et al., 2007). When we profiled brain-infiltrating IDH1/P53/ATRAX mutated LGA cells using IHC and immunofluorescence techniques for SOX2, we found low levels of SOX2 relative to NSCs in the SVZ (n=7) (Figure 4L, S5C,D). These findings support our hypothesis that SOX2 is downregulated in the gliomagenic transformation of NSCs and reproduce previous observations that SOX2 expression is relatively low in low-grade gliomas (Annovazzi et al., 2011; Guo et al., 2011; Ma et al., 2008).

### **The genomic region surrounding the SOX2 locus is hypermethylated and has diminished CTCF occupancy**

To investigate the mechanism of *SOX2* downregulation, we examined the methylation status of the *SOX2* promoter using our methylation array data. We found no appreciable DNA methylation change in 3-hit relative to vector NSCs (Figure 5A). We confirmed this finding by comparing wild-type IDH (n=53) and mutant IDH (n=157) LGGs from the TCGA (Cancer Genome Atlas Research et al., 2015). When we examined a 1.2 Mb-wide genomic region surrounding the *SOX2* locus, we observed increased DNA methylation in specific areas upstream and downstream of *SOX2* in 3-hit vs. vector NSCs, and a similar trend when comparing mutant to wild-type IDH gliomas in the TCGA (Figure 5B). We therefore hypothesized there may be other regulatory elements sensitive to methylation in these regions.

CTCF functions as a genomic insulator, but can also facilitate contacts between promoters and enhancers (Bell et al., 1999; Kim et al., 2007; Phillips and Corces, 2009). As an insulator, CTCF is necessary for delimiting borders between Topologically Associating Domains (TADs) (Dixon et al., 2012; Nora et al., 2012). Its binding to its DNA motifs is sensitive to methylation (Bell and Felsenfeld, 2000; Wang et al., 2012). Flavahan et al. (2016) showed that DNA hypermethylation in IDH-mutated high-grade gliomas causes the promoter of an oncogene (*PDGFRA*) to ectopically associate with an enhancer in a neighboring TAD due to disruption of CTCF binding and loss of inter-TAD insulation. Using available CTCF chip-seq data from wild-type and mutated IDH high-grade gliomas from Flavahan et al., we identified CTCF sites around the *SOX2* gene with CpGs in their motifs (Figure 5C,D). This raised the possibility that downregulation of *SOX2* in 3-hit NSCs could be due to aberrant chromatin looping brought about by reduced CTCF binding at hypermethylated motifs.

All four CTCF motifs upstream of the *SOX2* promoter, and a single site ~1Mb downstream, had CpGs directly in the motif, suggesting sensitivity to methylation. To understand if direct hypermethylation of CTCF sites could lead to decreased CTCF occupancy at these CTCF sites, we performed targeted bisulfite sequencing of vector and 3-hit NSCs (n=10/motif) (Figure 5E). We found higher levels of methylation in 3 of 5 sites examined. The hypermethylation in 3-hit NSCs was particularly prominent at a CTCF motif 11 kb upstream of the *SOX2* gene (Figure 5Ei). To assess whether or not CTCF occupancy at these motifs had changed, we performed ChIP-qPCR for CTCF (Figure 5F). Every site assayed had a ~2-fold decrease in CTCF occupancy, supporting the hypothesis that DNA hypermethylation in 3-hit NSCs leads to reduced CTCF occupancy around the *SOX2* locus.

### **The *SOX2* promoter has diminished contacts with putative downstream long-range enhancer regions in 3-hit conditions**

Since CTCF organizes chromatin looping, we analyzed publicly available HiC plots of NSCs (Dixon et al., 2015) and found *SOX2* has strong contacts with multiple areas within its TAD (Figure 6A, S6A). To understand if loss of CTCF binding affects chromatin contacts at the *SOX2* locus, we performed circularized chromosome conformation capture (4C-Seq) using the *SOX2* promoter as bait to identify genomic interactions that may regulate its expression (Figure 6B, S6B). We discovered strong *cis* interactions ~700 kb downstream of *SOX2* in our control NSCs. These interactions were all apparent in NSC HiC data (Figure 6A) and significantly reduced in 3-hit NSCs.

To determine if this strong long-range contact represents a promoter-enhancer interaction, we examined available epigenome data from the roadmap epigenome project (Roadmap Epigenomics et al., 2015) (Figure 6C). Remarkably, for nearly every cell type examined (n=127), a transcriptionally active TSS site at the *SOX2* gene correlated with the presence of enhancers ~0.5–1 Mb downstream of the gene. To see if this same pattern of chromatin contacts is maintained in other cell types, we examined the HiC profiles of hESCs, which express high levels of *SOX2*, and IMR90 lung fibroblasts, which are low for *SOX2* (Figures 6D,E, S6A,C,D). We found that hESCs maintained a HiC profile very similar to that of NSCs. In contrast, in IMR90 cells, TAD boundaries were similar but *SOX2* did not have robust contacts with the genomic regions that corresponded to the enhancer elements. These findings suggest that in LGA *SOX2* downregulation is due to aberrant chromatin looping that results in disassociation of the *SOX2* promoter from a downstream enhancer.

### **Ectopic expression of *SOX2* rescues the block in differentiation**

To validate the critical role of *SOX2* in gliomagenesis, we ectopically expressed *SOX2* in all conditions studied and subjected them to astrocytic and neuronal differentiation. NSCs were transduced with a lentivirus constitutively expressing *SOX2*-P2A-GFP, or an empty vector (Figure 7A, S7A). After ectopic *SOX2* expression, 3-hit cells showed differentiation levels similar to control NSCs (Figure 7B,C, S7B,C). This finding suggested that restoring *SOX2* expression in 3-hit NSCs was sufficient to rescue the differentiation block and confirmed a central role for transcriptional downregulation of *SOX2* in LGA formation.



## DISCUSSION

The role of individual oncogenes and tumor suppressors in the initiation of LGA remains poorly understood. Mutant IDH1 is a shared core mutation in both LGA and oligodendroglioma (Cancer Genome Atlas Research et al., 2015; Parsons et al., 2008), suggesting the cell of origin is a shared neuroglial progenitor (Bardella et al., 2016; Rosiak et al., 2016).

Our model shows that the combination of the 3 oncogenic hits promotes gliomagenesis not by altering cell growth but by arresting differentiation of NSCs (Pirozzi et al., 2017; Rosiak et al., 2016; Sulkowski et al., 2017), which become locked in a self-renewing and brain-invasive state. Several lines of evidence support the notion that the IDH1 mutation is the inciting oncogenic hit in LGA. First, exome sequencing of IDH-mutated astrocytoma at initial diagnosis and recurrence showed that, while the IDH1 is preserved, distinct clonal mutations in P53 and ATRX emerge at recurrence (Johnson et al., 2014). Second, expression of mutant IDH1 alone in progenitor cells leads to pre-tumorigenic changes (Bardella et al., 2016; Figueroa et al., 2010; Lu et al., 2012; Pirozzi et al., 2017; Rosiak et al., 2016; Saha et al., 2014; Turcan et al., 2012). Third, germline mosaicism for neomorphic IDH mutations in Ollier disease can result in brain astrocytomas (Amary et al., 2011; Bonnet et al., 2016; Pansuriya et al., 2011). In contrast, loss of ATRX by itself in a wild-type P53 background does not lead to brain tumor formation (Seah et al., 2008). Similarly, *TP53* loss in the brain does not result in tumor formation by itself, unless other oncogenes are introduced (Liu et al., 2011; Zheng et al., 2008). We therefore propose that the most likely order of the 3 oncogenic hits is IDH mutation, followed by loss of P53 and finally loss of ATRX.

We identified transcriptional downregulation of *SOX2* as a central mechanism underlying the differentiation block. Our hypothesis that *SOX2* is downregulated in the transition from NSCs to LGA tumor cells was corroborated by immunostaining of human cadaveric adult SVZ tissue and IDH1-mutant LGA. *SOX2* is not only required for self-renewal, but is also the guardian of NSC multipotency, by helping maintain bivalent chromatin marks on pro-differentiation genes. Therefore, its downregulation in 3-hit NSCs provides a robust explanation for the acquired arrest in differentiation.

Despite the global DNA hypermethylation induced by mutant IDH1, we did not find hypermethylation of the *SOX2* promoter. In mouse ESCs, expression of *SOX2* is maintained by chromosomal looping and association with *cis* downstream enhancers (Li et al., 2014; Sikorska et al., 2008). Our study provides evidence that in human NSCs, *SOX2* expression is dependent on contact with enhancers 700 kb downstream via CTCF-dependent chromatin looping. This chromatin loop is disrupted in 3-hit NSCs due to hypermethylation of CTCF motifs flanking the *SOX2* locus, leading to decreased *SOX2* expression and differentiation block. This disruption in chromatin conformation mechanistically resembles the findings of Flavahan et al. (2016) in IDH-mutated high-grade glioma. However, we show that unraveling of chromatin leads to disassociation of the *SOX2* promoter from its enhancer and a differentiation block, rather than ectopic activation of an oncogene from a neighboring TAD.

Our model provides a tractable platform to study serial addition of clinically relevant oncogenic hits to human NSCs. We used this system to study the earliest stages of IDH-mutated LGA formation and discovered a fundamental gliomagenesis mechanism revolving around abnormal chromatin looping, transcriptional downregulation of *SOX2* and impaired NSC differentiation. Our findings underscore the importance of chromatin conformation as a critical epigenetic mechanism of tumor initiation in LGA and likely other malignancies.

## EXPERIMENTAL PROCEDURES

Detailed methods can be found in the Supplementary Experimental Procedures section. Human ESCs with a HES5::GFP reporter (Placantonakis et al., 2009) were used to derive NSCs and their progeny (astrocytes, neurons and oligodendrocytes). All hESC experiments were approved by NYU's ESCRO (protocol #14-00267). NSCs were maintained in medium containing EGF and FGF2. Stable NSC lines were generated by delivering transgenes with lentiviruses. Standard techniques and analysis was used for flow cytometry, extreme limiting dilution sphere assays, qPCR, immunoblot, immunofluorescence and IHC. Animal procedures were performed according to IACUC protocol 160403 at NYU. For xenograft invasion assays, male NOD.SCID mice (6–8 weeks) were stereotactically injected with  $2.5 \times 10^5$  NSCs in the frontal lobe, as previously described (Bayin et al., 2014). Xenografts were analyzed 4 weeks post injection. Images were processed with ImageJ software.

NSCs were harvested in self-renewing conditions for RNA-seq, DNA methylation profiling with Illumina 450K arrays, MS and 4C-seq. RNA-seq and DNA methylation data from our NSCs were compared to TCGA data (Cancer Genome Atlas Research et al., 2015). Data were visualized with R software suite ([www.r-project.org](http://www.r-project.org)). To generate a 4C library for sequencing, we adapted our recently described protocol (Raviram et al., 2016; Rocha et al., 2016) to capture interactions from the *SOX2* promoter.

CTCF ChIP-seq data from 2 grade III mutant IDH and 2 grade IV wild-type IDH datasets (GSE70991), as in Flavahan et al. (2016), were used to identify CTCF binding sites near the *SOX2* locus. All tracks were plotted on the same intensity scale. We visualized the 25-state imputed chromHMM model that uses integrative data from 127 cell lines that had at least five different chromatin marks used to annotate the epigenome (Roadmap Epigenomics et al., 2015). For HiC data (GSE35156 and GSE52457), publicly available (Dixon et al., 2015; Dixon et al., 2012) datasets from lung fibroblasts (IMR90), H1 hESCs and NSCs were used (Lazaris et al., 2017).

Statistical comparisons were performed with t-test,  $\chi^2$  test, and ANOVA (one- and two-way). Statistical significance was set at  $p < 0.05$ . Significant ANOVA comparisons were followed by *post hoc* Tukey's test, Dunnett's test, or the Benjamini false discovery rate correction. Statistical analyses were performed using Prism 7 (Graphpad) software. The n value signifies biological replicates. Statistics for RNA-seq, 450k methylation array and 4C analysis were performed using built-in statistical methods in bioinformatics packages and/or the R software suite ([www.r-project.org](http://www.r-project.org)).

## Supplementary Material

Refer to Web version on PubMed Central for supplementary material.

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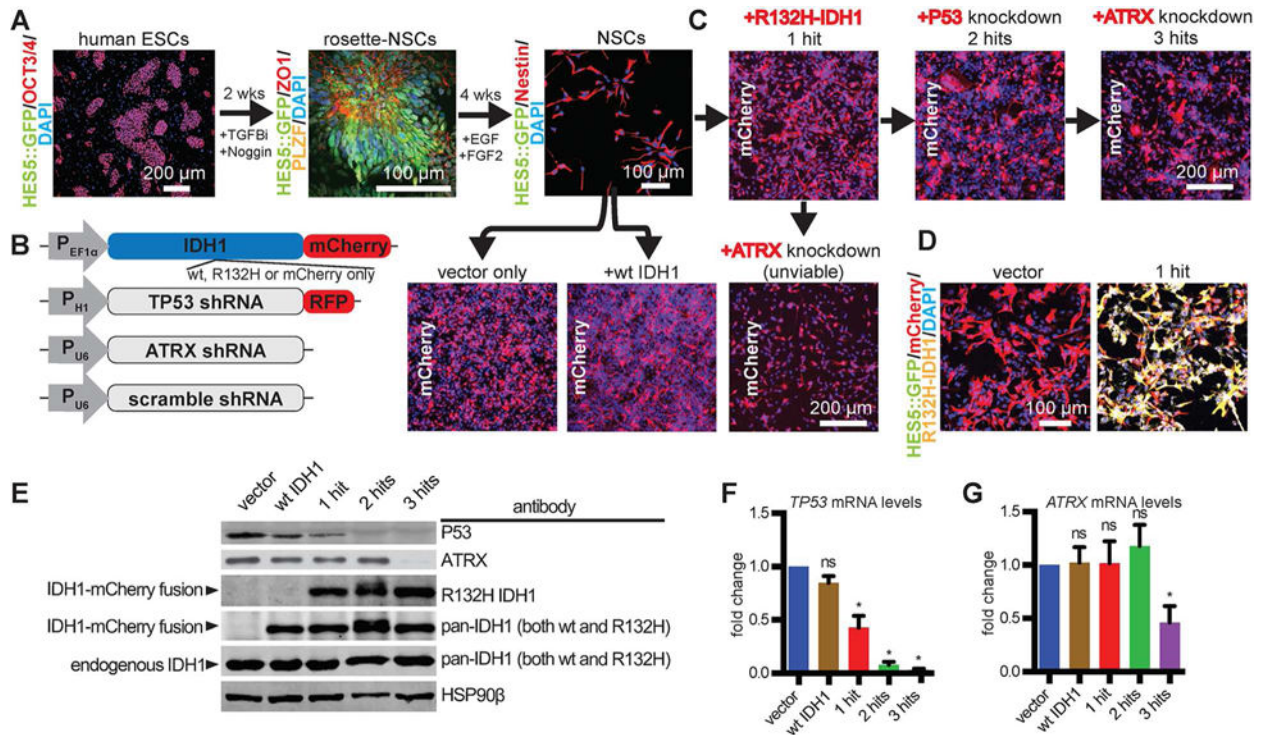
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**HIGHLIGHTS**

- R132H IDH1 and P53/ATRX knockdown block differentiation of human neural progenitors
- The differentiation block is mediated by transcriptional silencing of *SOX2*
- The *SOX2* promoter disassociates from its enhancer due to disrupted chromatin looping
- Reduced binding of CTCF to hypermethylated DNA motifs alters chromatin conformation



**Figure 1. Generation of human NSCs with ectopically expressed R132H IDH1, P53 knockdown and ATRX knockdown**

**A.** Human ESCs (OCT3/4+, HES5::GFP<sup>-</sup>) were progressed to rosette-NSCs (ZO1+, PLZF+, Hes5::GFP+) over two weeks with TGFβ inhibitor SB431542 (TGFβi; 10 μM) and noggin (100 ng/mL). HES5::GFP+ rosette structures were mechanically dissociated and plated at high densities in EGF and FGF2 over 4 weeks to produce NSCs growing as a monolayer (Nestin+, HES5::GFP<sup>-</sup>).

**B.** Lentiviral constructs used to engineer NSCs. P<sub>EF1α</sub>, EF1α promoter; P<sub>H1</sub>; H1 promoter; P<sub>U8</sub>, U8 promoter; RFP, red fluorescent protein.

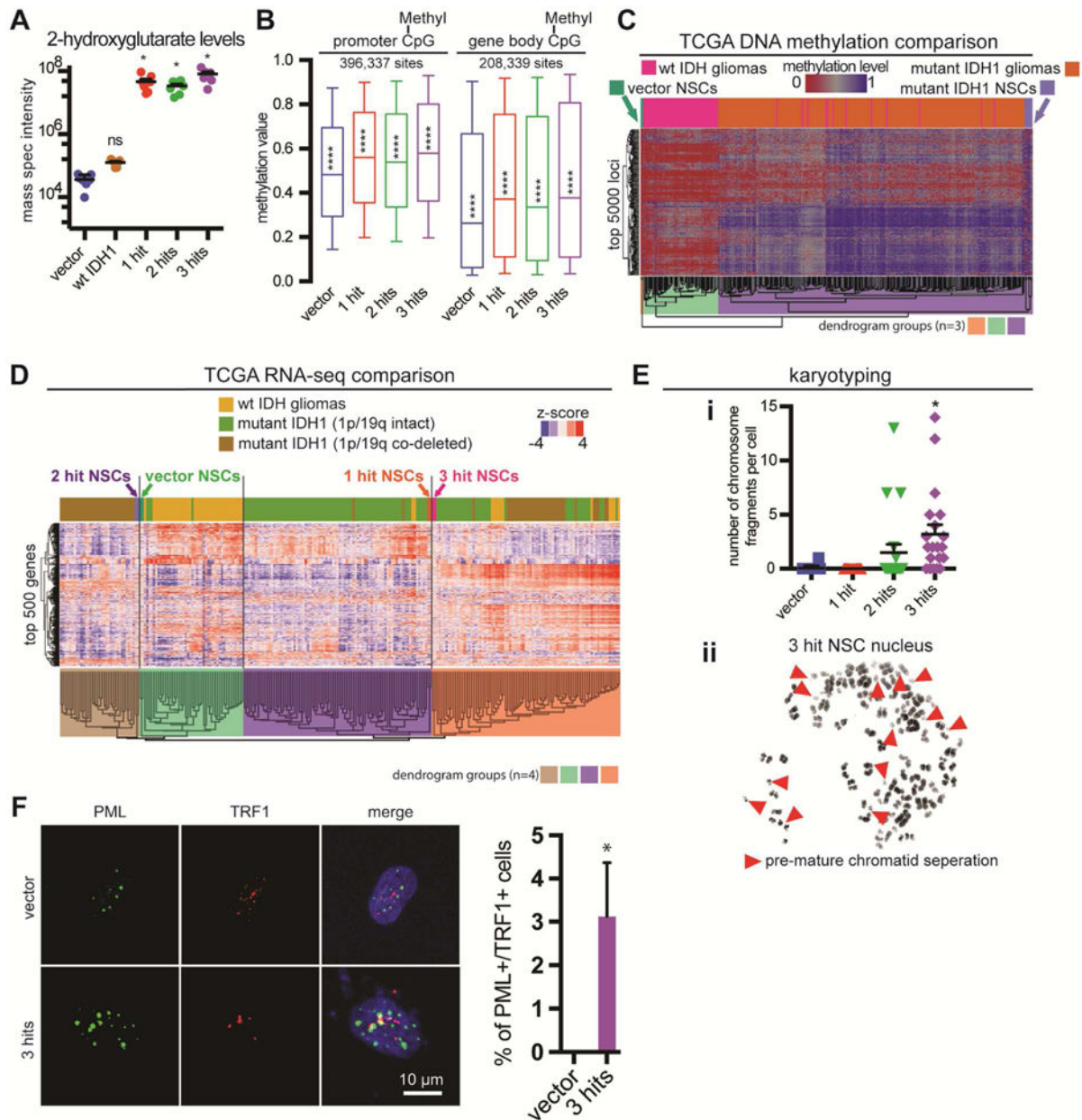
**C.** Wild-type NSCs were infected with lentiviruses to constitutively express either mCherry alone (vector only), wild-type IDH1-mCherry, or mutant R132H-IDH1-mCherry (1-hit). Cells were then purified for mCherry via FACS sorting. Following these transductions and sorts, cells were transduced with shRNA lentiviruses against P53 or ATRX, in either order. Cells that received ATRX shRNA as the second hit became unviable.

**D.** Immunofluorescence microscopy of mCherry, HES5::GFP and R132H-IDH1 in vector and 1-hit NSCs.

**E.** Western blot using antibodies against P53, ATRX, the R132H mutation and total IDH1. HSP90β, loading control.

**F.** qRT-PCR of *TP53* mRNA levels across different conditions (n = 3/condition; ANOVA F<sub>(4,10)</sub>=48.49, p=0.0048). \*p<0.05, *post hoc* Dunnett’s test; ns, not significant.

**G.** qRT-PCR of *ATRX* mRNA levels across different conditions (n = 3/condition). \*p<0.05, t-test between vector and 3-hit conditions. ns, not significant.



**Figure 2. Metabolic, transcriptional, epigenetic and karyotypic properties of transgenic NSCs**  
**A.** Quantitative MS for 2HG in genetically modified NSCs (n=6/condition, ANOVA  $F_{(4,30)}=17.91$ ,  $p<0.0001$ ). \* $p<0.05$ , *post hoc* Dunnett’s test; ns: not significant.  
**B.** Boxplots of beta (methylation) values of CpG sites with probes at genome-wide sites marked as promoters (–1.5kb to +0.5kb from TSS, n=396,337 CpG sites) and at gene bodies (coding and non-coding regions of a gene, n=208,339 sites). NSCs with IDH1 mutation have globally elevated levels of methylation. Statistics for promoter CpGs: n=2 arrays/condition, ANOVA  $F_{(3,122696)}=475.5$ ,  $p<0.0001$ ; Statistics for gene body CpGs: n=2 arrays/condition, ANOVA  $F_{(3,123352)}=283.7$ ,  $p<0.0001$ . \*\*\*\* $p<0.0001$ , *post hoc* Tukey’s test.

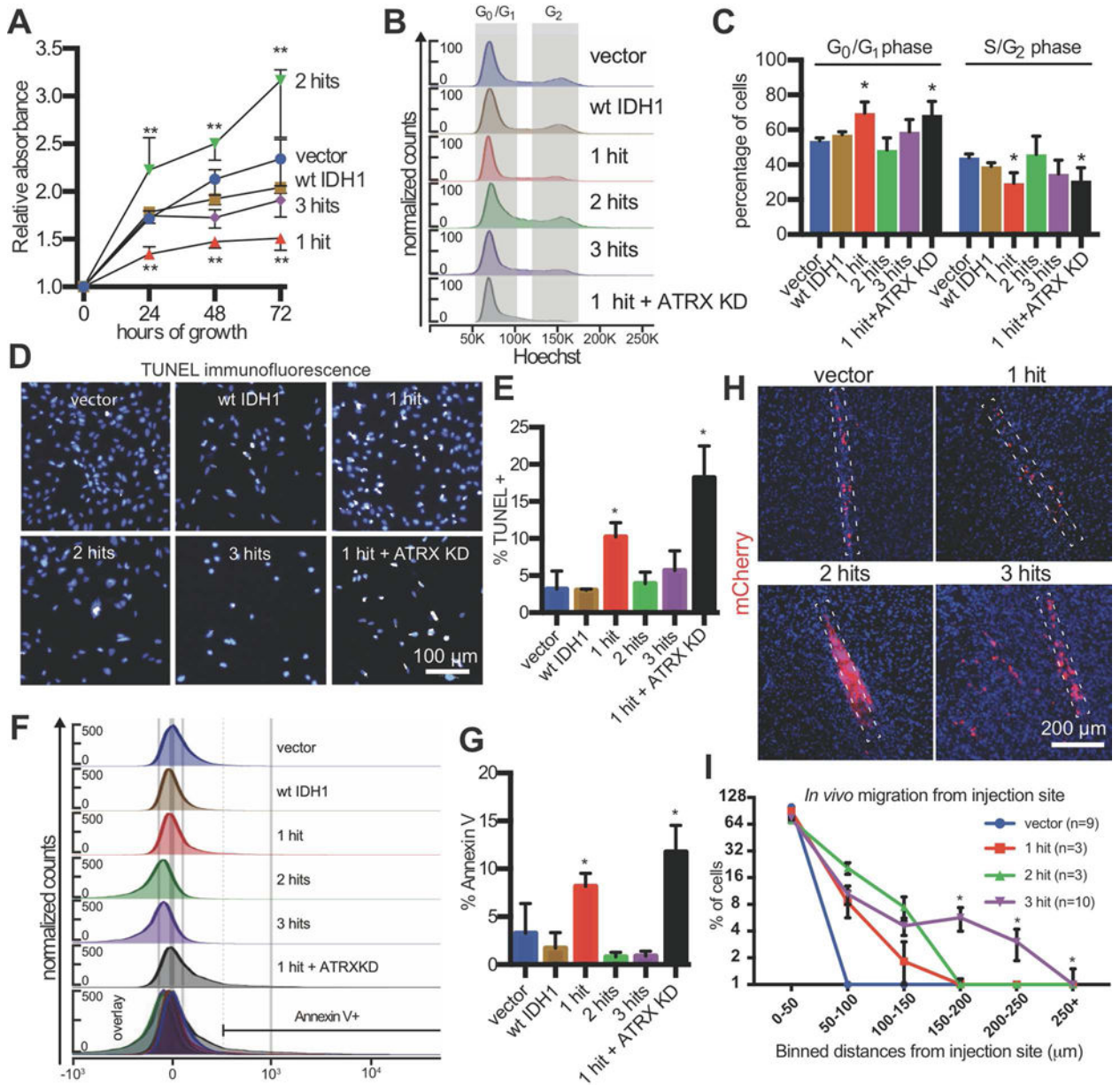
**C.** Hierarchical clustering of NSCs with LGGs (wild-type and mutant IDH1 demarcated) using the top 5000 most variable loci defined amongst the TCGA samples. The first three dendrogram levels are highlighted.

**D.** Hierarchical clustering of NSCs with LGGs (wild-type vs. mutant IDH1 and 1p/19q status demarcated) using the top 500 most variable genes defined amongst the TCGA samples. The first four dendrogram levels are highlighted.

**E. i.** The number of chromosome fragments per cell were significantly increased in 3-hit NSCs (n=20, ANOVA  $F_{(3,76)}=11$ ,  $p=0.0004$ ). \* $p<0.05$ , *post hoc* Tukey's test. **ii.** 3-hit NSCs had a high frequency of premature chromatid separation (red arrowheads).

**F.** PML and TRF1 show co-localization in ~3.1% of 3-hit NSCs, but are not detected in vector NSCs (n=3 trials, 3 fields per trial; n=139 total vector NSCs, n=165 total 3-hit NSCs; \* $p<0.05$ , paired t-test).





**Figure 3. Mutant IDH1, P53 shRNA and ATRX shRNA differentially alter NSC growth rate, cell death and invasiveness**

**A.** *In vitro* growth assay. NSCs were plated at equal densities and absorbance was measured by WST-1 daily to determine cellular proliferation (n=3/condition, ANOVA  $F_{(4,8)}=35.81$ ,  $p<0.001$ ). \*\* $p<0.01$ , *post hoc* Dunnett’s test.

**B.** Representative flow cytometric cell cycle analysis.

**C.** Quantification of cell cycle phases (n=3/condition, ANOVA  $F_{(1,4)}=7.98$ ,  $p=0.0003$ ). \*\* $p<0.01$ , *post hoc* Dunnett’s test.

**D.** Representative immunofluorescence microscopic image of TUNEL staining.

**E.** Quantification of TUNEL+ cells in (D) (n=3/condition, ANOVA  $F_{(2,10)}=17.58$ ,  $p=0.0208$ ). \* $p<0.05$ , *post hoc* Tukey’s test.

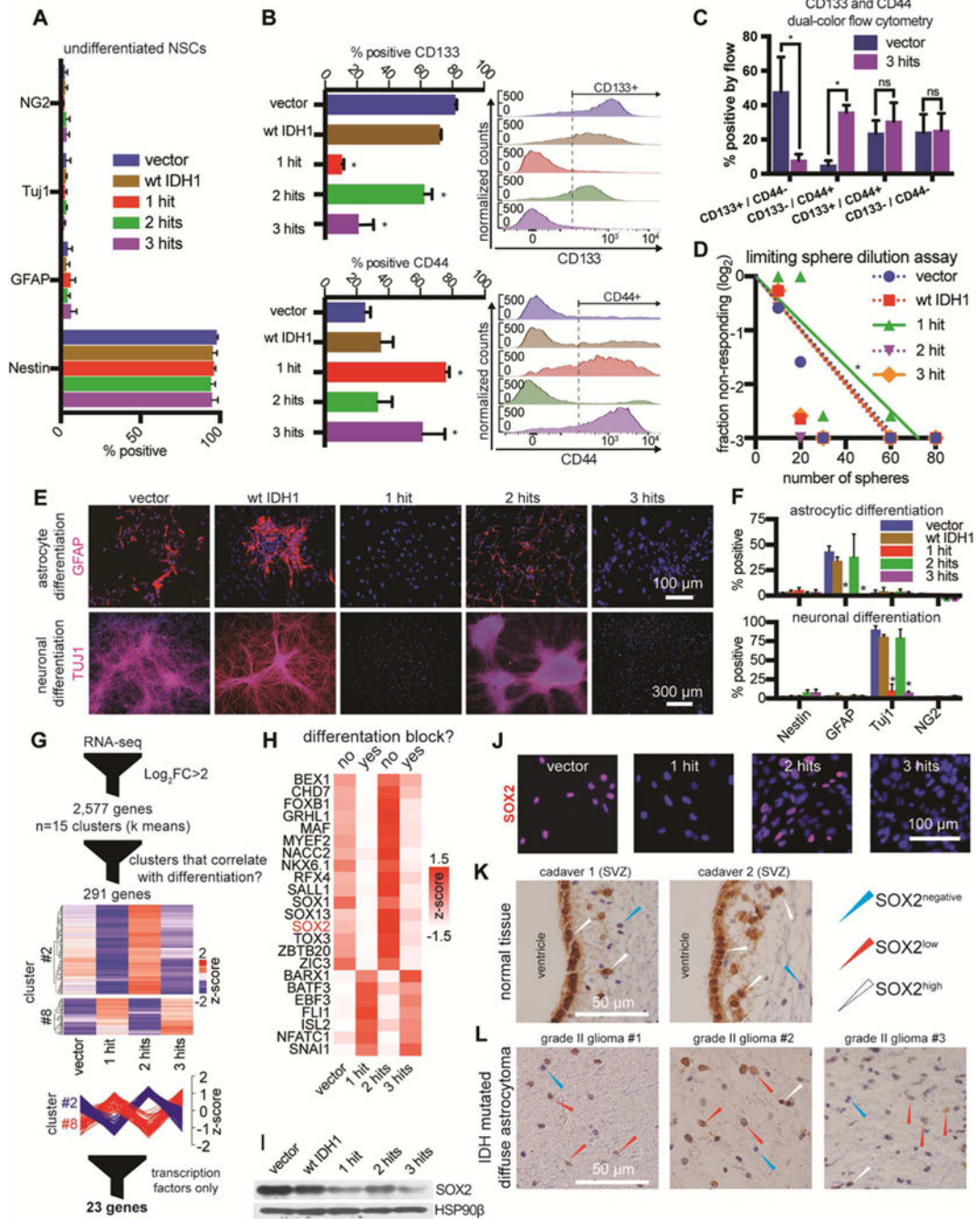
**F.** Representative histogram plots of Annexin V flow cytometry.

**G.** Annexin V was significantly elevated in 1-hit and R132H/ATR<sub>X</sub> KD NSCs (n=3/condition, ANOVA  $F_{(5,12)}=16.5$ ,  $p<0.0001$ ). \* $p<0.05$ , *post hoc* Tukey's test.

**H.** *In vivo* invasion assay. mCherry immunostaining of brain sections showing xenografts of NSCs ( $2.5\times 10^5$  cells, 4 weeks post-injection) in the frontal lobe of NOD.SCID mice. The dotted rectangles outline the injection tracks.

**I.** Quantification of the percentage of mCherry+ NSCs in binned distances away from the injection site (n=3–10 mice/condition, 3 fields per mouse). Above the 150  $\mu\text{m}$  cutoff, the 3-hit condition was significantly different from all others (two-way ANOVA  $F_{(3,16)}=9.487$ ,  $p<0.001$ ). \* $q<0.05$ , *post hoc* Benjamini correction.





**Figure 4. Impaired differentiation in 3-hit NSCs is associated with transcriptional downregulation of *SOX2***

**A.** Immunofluorescence quantification of Nestin, GFAP, TUJ1 and Ng2 in NSCs cultured with EGF/FGF2.  
**B.** Flow cytometric detection of CD133 (n=3/condition, ANOVA  $F_{(4,10)}=53.09$ ,  $p<0.0001$ ) and CD44 (n=3/condition, ANOVA  $F_{(4,10)}=6.83$ ,  $p<0.001$ ). \* $p<0.05$ , *post hoc* Tukey's test.  
**C.** CD133 and CD44 dual color flow cytometry (n=3/condition, multiple t-tests). \* $p<0.05$ ; ns, not significant.  
**D.** limiting sphere dilution assay (n=3/condition, multiple t-tests). \* $p<0.05$ ; ns, not significant.  
**E.** immunofluorescence for astrocyte and neuronal differentiation (n=3/condition).  
**F.** quantification of astrocytic and neuronal differentiation (n=3/condition).  
**G.** RNA-seq analysis of 2,577 genes (n=3/condition).  
**H.** heatmap of a differentiation block (n=3/condition).  
**I.** Western blot for SOX2 and HSP90β (n=3/condition).  
**J.** immunofluorescence for SOX2 (n=3/condition).  
**K.** SOX2 staining in normal tissue (n=3/condition).  
**L.** SOX2 staining in IDH mutated diffuse astrocytoma (n=3/condition).

**D.** Sphere formation assay in limiting dilutions (n=3/condition,  $\chi^2$  pairwise tests, p<0.001).

**E.** Representative immunofluorescence microscopic images of GFAP and TUJ1 in cultures that were differentiated to astrocytes (top) or neurons (bottom).

**F.** Quantification of immunofluorescence markers in astrocytic (top) or neuronal (bottom) differentiation conditions. Astrocyte differentiation: n=3/condition, ANOVA  $F_{(4,40)}=10.75$ , p<0.0001; Neuronal differentiation: n=3/condition, ANOVA  $F_{(4,40)}=86.68$ , p<0.0001.

\*p<0.05, *post hoc* Tukey's test.

**G.** Vector, 1-hit, 2-hit and 3-hit NSCs were subjected to RNA-seq in duplicates. We found 2,577 differentially expressed genes ( $\log_2$  fold-change>2 and  $q_{\text{value}}<0.05$ ). Genes were clustered into 15 k means groups and represented on a heatmap with no column clustering. Two of the 15 groups had genes with expression patterns that strongly correlated or anti-correlated with the ability of NSCs to differentiate (n=291 genes). Within these 2 groups we identified 23 transcription factors with IPA.

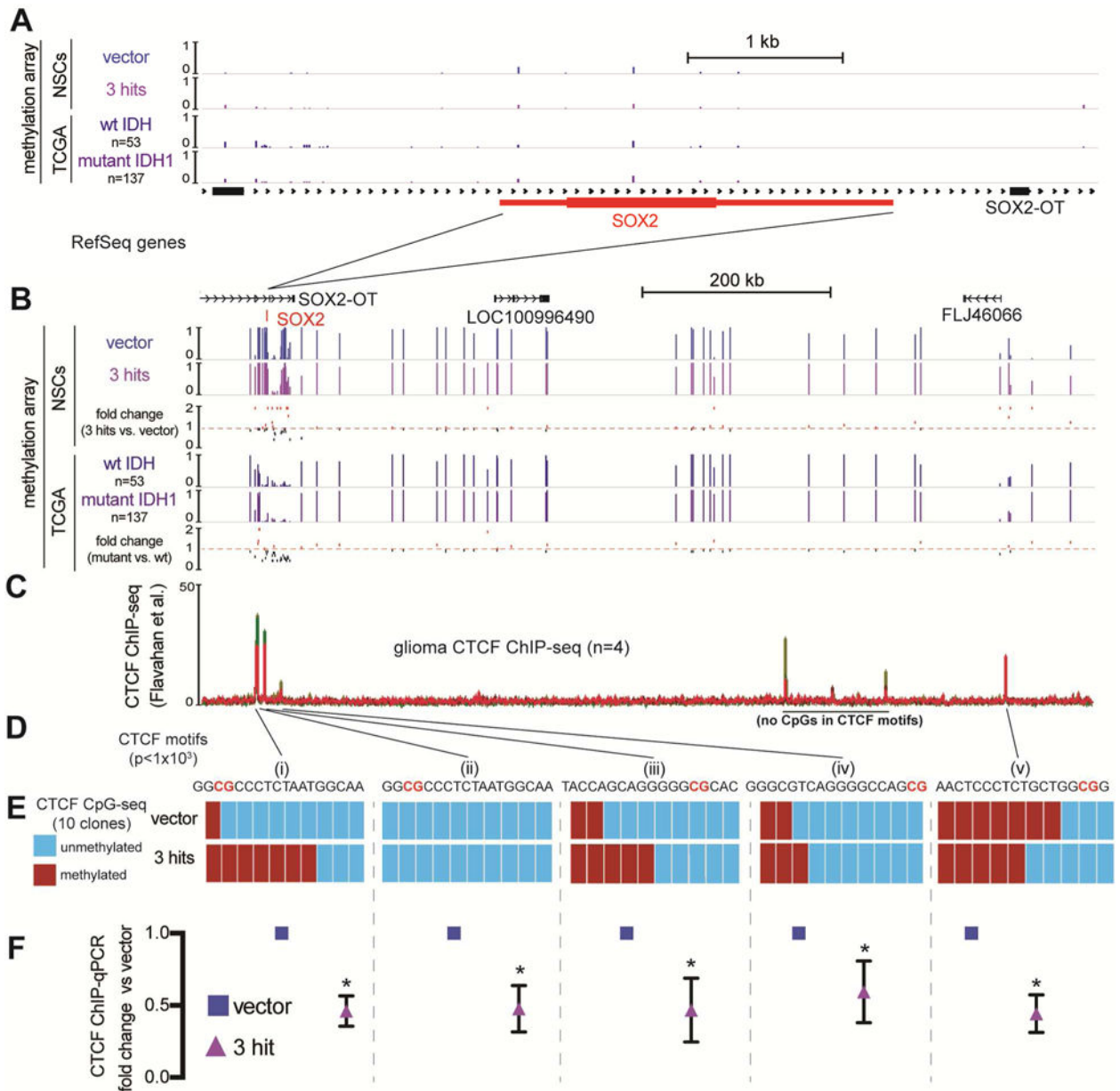
**H.** Transcription factors from (G) were visualized on a heatmap. The list includes *SOX2*, whose levels correlated with the ability of cells to differentiate.

**I.** Western blot of NSCs shows that SOX2 protein is downregulated most heavily in 1-hit and 3-hit NSCs, and to a lesser degree in 2-hit NSCs. HSP90 $\beta$ , loading control.

**J.** Immunofluorescence microscopy of NSCs stained for SOX2.

**K.** Cadaver tissue immunohistochemical staining of SOX2 reveals SOX2<sup>high</sup> ependymal cells and NSCs in the SVZ (n=2 adult patients).

**L.** LGA tumors (IDH mutated, P53 and ATRX loss, 1p/19q intact) showing diffuse brain infiltration contain predominantly SOX2<sup>low</sup> tumor cells (n=3 tumors).



**Figure 5. Mutant IDH1-mediated hypermethylation around the *SOX2* locus leads to diminished CTCF occupancy**

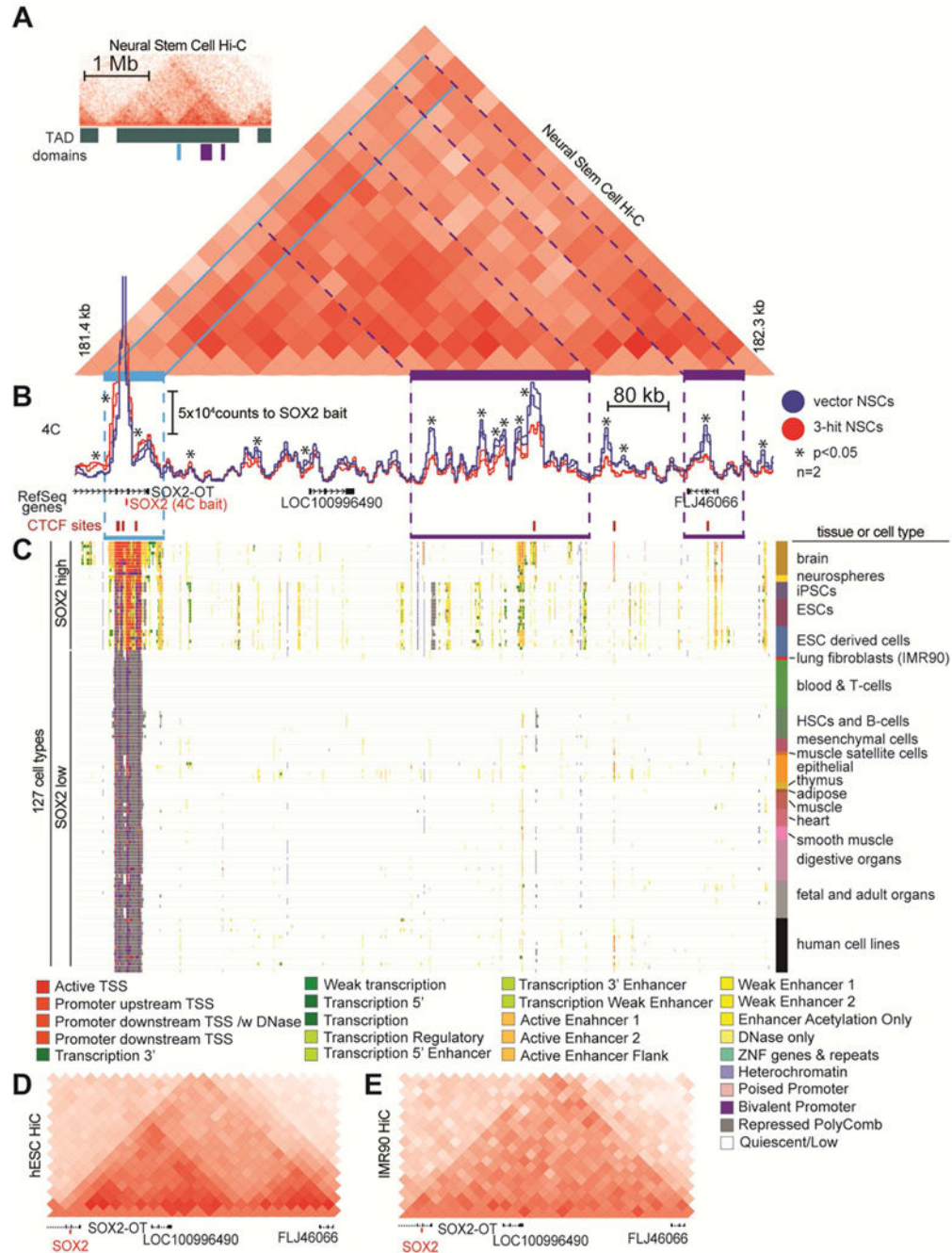
**A.** The *SOX2* locus (~6 kb window) aligned to 450k methylation array tracks of NSCs with the indicated transgenes (n=2) and averaged methylation beta values from TCGA grade II wild-type IDH gliomas (n=53) and mutant IDH, 1p/19q intact astrocytomas (n=157). The *SOX2* locus has low levels of methylation in all these conditions. RefSeq genes are shown.

**B.** The region (~1 Mb) containing the *SOX2* locus with tracks from (A). Shown below each pair of tracks is the calculated fold change in methylation beta value. Mutant IDH astrocytomas vs. wild-type IDH gliomas share a similar pattern of changes in methylation as the comparison of 3-hit NSCs vs. vector NSCs.

**C.** CTCF ChIP-seq tracks from grade III and IV gliomas (Flavahan et al., 2016). Red: mutant IDH grade III gliomas; Green: wild-type IDH grade IV gliomas.

- D.** CTCF motif analysis of each ChIP peak reveals high confidence CTCF motif locations with CpG sites highlighted in red (MEME suite motif scanning,  $p < 0.001$ )
- E.** Targeted bisulfite sequencing of CpG sites within indicated CTCF motifs. Ten clones of vector and 3-hit NSCs were sequenced for every site. The most robust hypermethylation in 3-hit NSCs was observed in a CTCF site upstream of *SOX2* (i).
- F.** CTCF ChIP-qPCR of each corresponding CTCF site. CTCF occupancy was reduced approximately ~2-fold in every site assayed ( $p < 0.01$ , multiple t-tests).





**Figure 6. The promoter of *SOX2* has decreased long-range contacts with putative downstream enhancers in 3-hit NSCs**

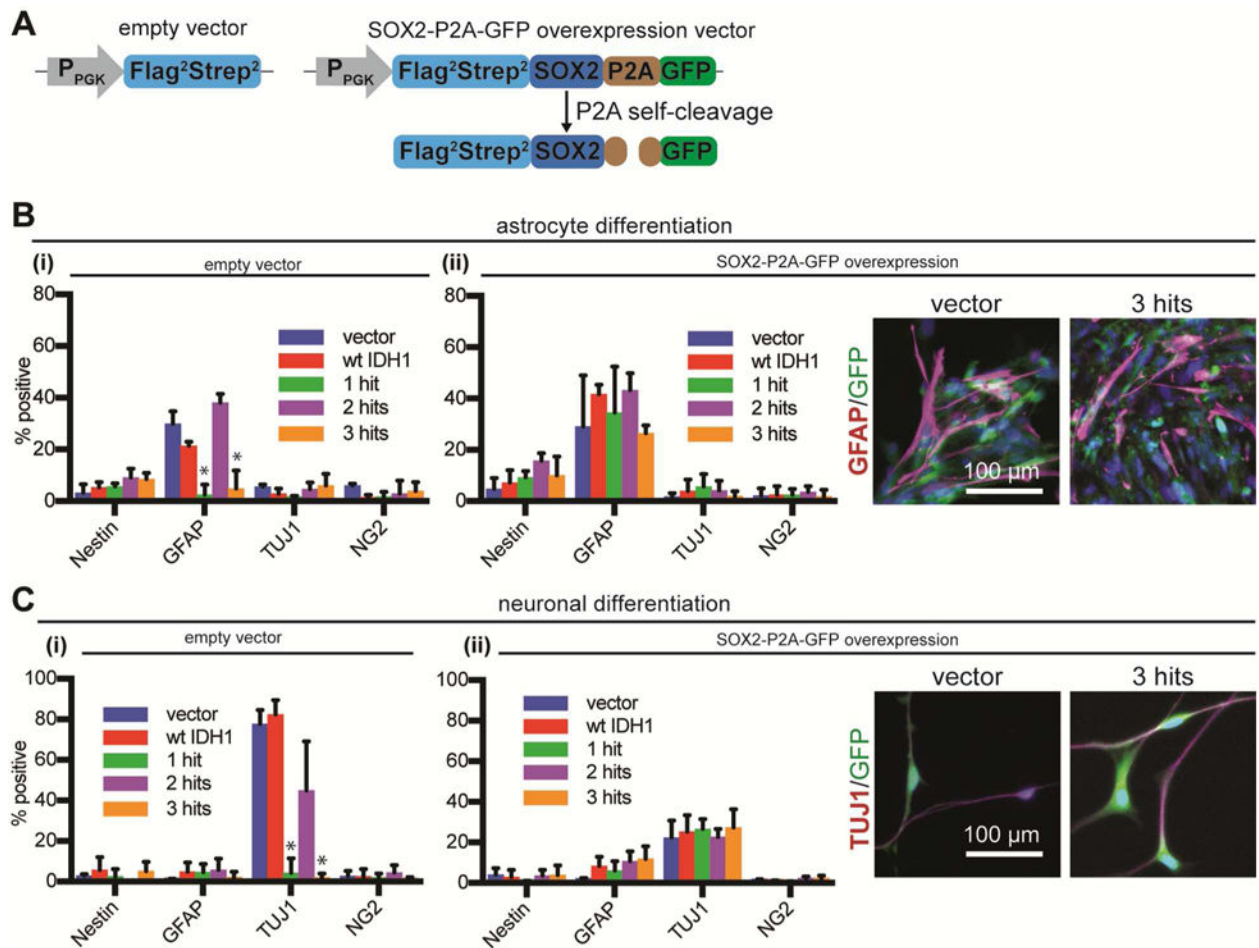
**A.** HiC plots in human NSCs (derived from H1 hESCs) in 40 kb bins (Dixon et al., 2015), were reprocessed. The inset on the top left shows a 2 Mb window of the HiC plot, with TADs demarcated. The large HiC plot of a 1.2Mb window showing the genomic region containing *SOX2* (light blue highlight) has strong long-range contacts within the entire TAD region (purple highlights).

**B.** 4C using the *SOX2* promoter as bait reveals strong long-range downstream contacts in vector NSCs that are diminished in 3-hit NSCs (n=2/condition, p<0.001).

**C.** Epigenetic states of the genomic region downstream of *SOX2*. Epigenetic data is from the NIH Roadmap Epigenetics Consortium (Roadmap Epigenomics et al., 2015). Each row represents a cell type (n=127) with integrated epigenome data corresponding to 25 different chromatin states (see legend). Cell types that are high for *SOX2* have active TSSs and epigenetic marks in enhancer elements downstream of *SOX2* that correspond to 4C and HiC contact signals in **(A)** and **(B)** (purple highlighting).

**D,E.** HiC plot of **(D)** hESCs (SOX2 high) and **(E)** IMR90 lung fibroblasts (SOX2 low) using the same 1.2 Mb genomic window as in **(A)**. These plots demonstrate the genomic organization differences within the TAD that contains *SOX2*.





**Figure 7. SOX2 overexpression rescues the differentiation block in 3-hit NSCs**

**A.** Lentiviral constructs used for overexpression of SOX2. P<sub>PGK</sub>, PGK promoter.

**B,C.** Vector and 3-hit NSCs were transduced with (i) empty vector, or (ii) SOX2-P2A-GFP lentivirus, directed to differentiate to astrocytes (**B**) or neurons (**C**) and immunostained for Nestin, GFAP, TUJ1 and NG2. There was no difference between cultures overexpressing SOX2 ( $n=3/\text{condition}$ , ANOVA  $F_{(4,40)}=1.224$  for astrocytic and ANOVA  $F_{(4,40)}=2.1$  for neuronal differentiation, both  $p>0.05$ ). The expected differentiation profiles were seen with empty vector ( $n=3/\text{condition}$ , ANOVA  $F_{(4,40)}=48.65$  for astrocytic and ANOVA  $F_{(4,40)}=113$  for neuronal differentiation, both  $p<0.0001$ ). \* $p<0.05$ , *post hoc* Tukey's test.