



Identification of a putative molecular subtype of adult-type diffuse astrocytoma with recurrent MAPK pathway alterations

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Adult-type diffuse gliomas represent the most prevalent malignant primary tumors of the central nervous system (CNS), characterized by their highly invasive nature and therapy resistance [2, 6]. The 5th edition of the WHO classification of CNS tumors [5] classifies these gliomas primarily depending on the isocitrate dehydrogenase (*IDH1/2*) mutation status into three main types: IDH-mutant astrocytoma; IDH-mutant, 1p/19q co-deleted oligodendroglioma; and IDH-wildtype glioblastoma. Recent progress in molecular profiling by DNA methylation analysis or next-generation sequencing has illuminated the vast heterogeneity of CNS tumors in particular in the pediatric context but also more broadly [5, 7]. These analyses have also identified attractive druggable targets for therapeutic intervention, including common alterations within the mitogen-activated protein kinase (MAPK) pathway in pediatric low-grade gliomas [4] and others.

Here, we explored a molecularly distinct subset of diffuse gliomas ($n=32$), identified through unsupervised analysis of genome-wide DNA methylation data alongside copy number profiling and targeted next-generation sequencing. Application of unsupervised embedding analysis (t-SNE and UMAP) of DNA methylation profiles, alongside representative samples of established glioma types [1] unequivocally delineated these tumors as a distinct cluster (Fig. 1a, Supplementary Table 1 and 2, online resource). Analysis of copy number profiles derived from raw intensities of DNA methylation array probes revealed high-level amplification of *PDGFRA* in six of the 32 tumors. Amplification of *MYCN*

($n=2$) and *CDK4* ($n=2$) was observed in a smaller subset of cases. In one tumor, an *EGFR* amplification was found. Moreover, ten samples exhibited homozygous deletion of *CDKN2A/B*. Focal deletions in *NF1* ($n=4$), *TP53* ($n=2$) and *RBI* ($n=1$) were infrequent. Importantly, none of the cases exhibited the combined chromosome 7 gain and chromosome 10 loss characteristic of IDH-wildtype glioblastoma or 1p/19q-codeletion as seen in oligodendrogliomas [5]. Evaluation of *MGMT* promoter methylation status, inferred from DNA methylation array data, revealed an unmethylated profile in almost all cases (31/32).

Panel sequencing conducted on all 32 cases unveiled a significant prevalence of MAPK pathway alterations (Fig. 1b), including ten tumors with *NF1* mutations, four with *FGFR1* hotspot mutations (p.N546K or p.K656E), two with *BRAF* V600E mutation, and five with *PTPN11* mutation. Mutations in *EGFR* (p.A289T) and *KRAS* (p.V14I) were each seen in one case. Additionally, *TERT* promoter mutations were detected in eight tumors, alongside frequent alterations in *TP53* ($n=12$), *BCOR* ($n=5$), *SETD2* ($n=4$), and *ATRX* ($n=3$). Two tumors harbored an *NTRK2* fusion (*WNK2::NTRK2*, *NACC2::NTRK2*) and three a *PTPRZ1::MET* fusion. A comprehensive overview of the relevant variants detected is provided in Supplementary Table 3 (online resource). These findings highlight an enrichment of MAPK pathway alterations (78%) within this newly identified tumor subgroup, exhibiting a spectrum of alterations distinct from those commonly observed in other adult-type high-grade gliomas [5]. Given the availability of a variety of potent inhibitors targeting many of these alterations, this presents an enticing avenue for targeted therapeutic interventions [4].

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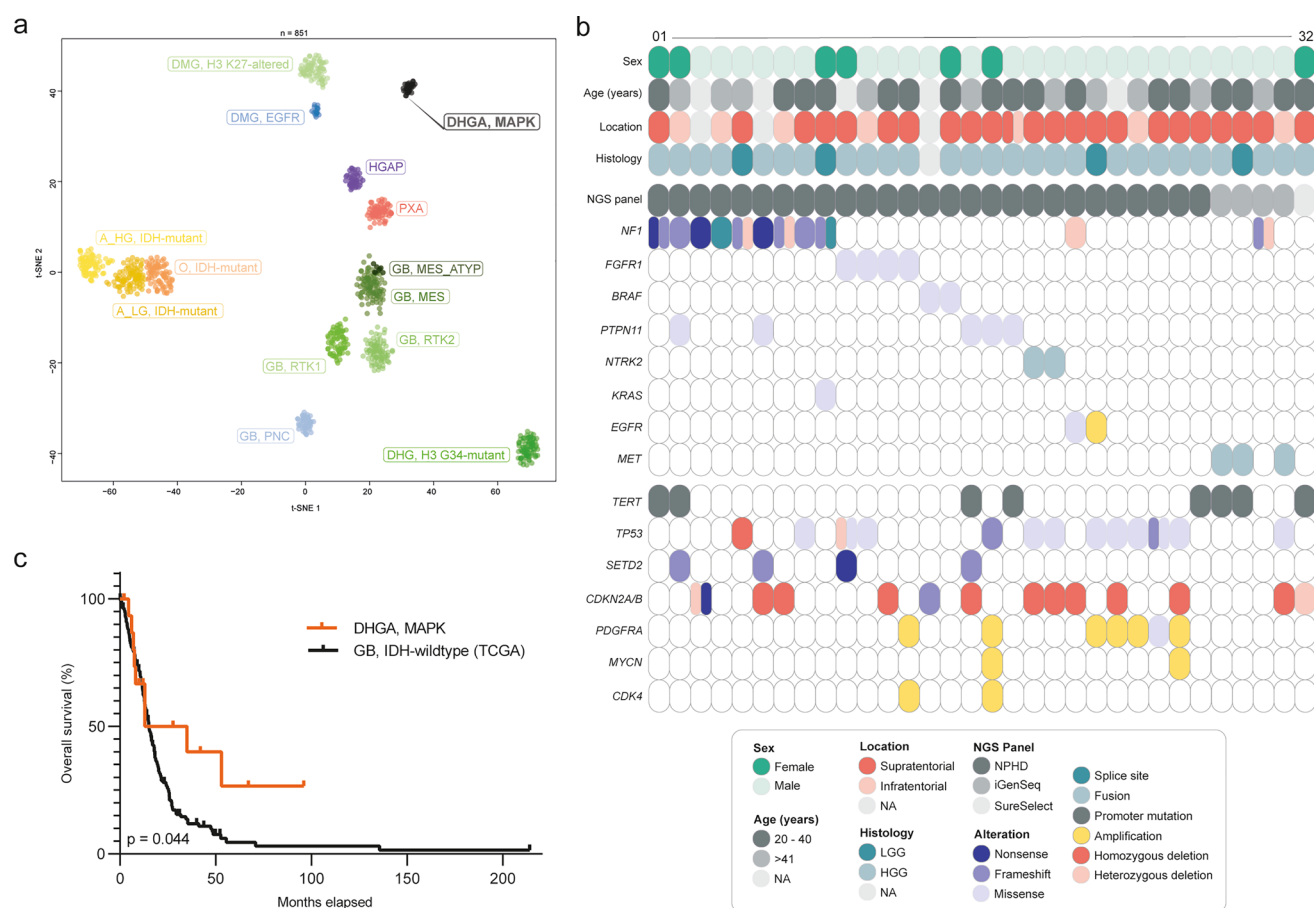


Fig. 1 Unsupervised, nonlinear t-distributed stochastic neighbor embedding (t-SNE) projection of DNA methylation array profiles from 851 tumors (a). DNA methylation profiling reveals a molecular distinct group of diffuse high-grade astrocytomas (DHGA, MAPK; $n=32$). For DNA methylation class abbreviations, see Supplemen-

tary Table 2. Clinicopathological characteristics and recurrent genetic alterations of the 32 diffuse gliomas (b). Kaplan–Meier curve for overall survival of 17 patients from the investigated series compared to a TCGA cohort of 230 IDH-wildtype glioblastoma patients (c)

Tumors within this series were predominantly located in the supratentorial compartment ($n=23$), with only single cases occurring infratentorially or in the spinal region (Fig. 1b). Patient age at diagnosis ranged from 17 to 78 years, with a median age of 32 years. Clinical outcome data (overall survival) were available for 17 patients, showing a median survival time of 24 months. Among these patients, nine (53%) have deceased. Compared to a TCGA cohort of 230 IDH-wildtype glioblastoma patients, this group exhibited a marginally more favorable survival rate ($p=0.044$; Fig. 1c). A small subset of patients ($n=4$) initially exhibited lower-grade gliomas several years ago. Although a clear progression toward high-grade glioma was not universally documented for these tumors, the data suggest a possible progressive disease, as observed in other diffuse gliomas. Additionally, for one patient, a diagnosis of neurofibromatosis type 1 was known. Lack of material did not allow for a full assessment of potential links to tumor predisposition syndromes although this should be explored

further in future given the high frequency of alterations affecting *NF1* and *PTPN11*.

The majority of tumors within this cohort were initially diagnosed histologically as high-grade glioma (27/32), predominantly glioblastoma, with a minority exhibiting lower-grade histological features. Histopathological review of 15 tumors revealed a relatively wide morphological spectrum of high-grade gliomas. All reviewed tumors shared a moderate to high increase in cellular density within a mostly fine fibrillary matrix. Tumors presented as polymorphous populations of predominantly astrocytic tumor cells with a variable degree of nuclear pleomorphism, often showing areas with giant cells and multinucleated cells with multiple tightly packed nuclei (Fig. 2a–d). Four of the cases exhibited focal oligodendroglial morphology with perinuclear halos due to cytoplasmic clearing (Fig. 2e). In one case, perivascular pseudorosettes and pleomorphic spindled cells were observed, at least focally. Ribbon-like structures were observed in one case. Calcifications were present in five

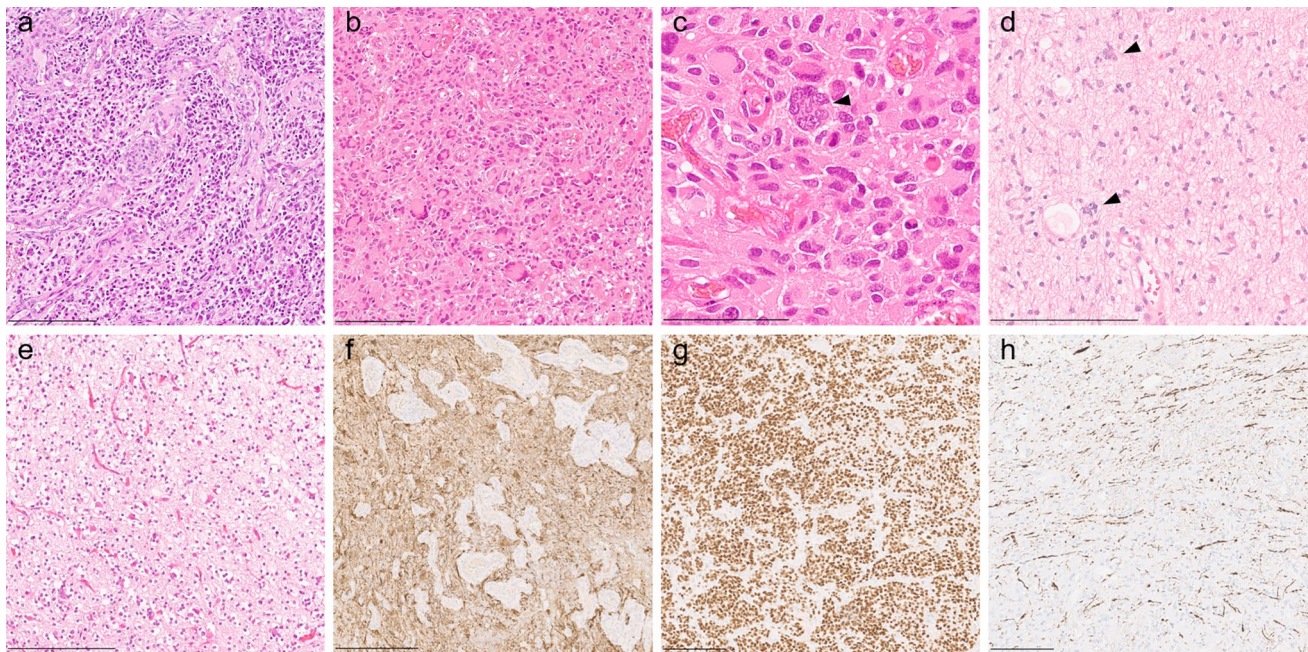


Fig. 2 Hematoxylin and eosin (H&E) stainings showing pleomorphic astrocytic neoplasm with microvascular proliferation (a), giant cells (b) and multinucleated cells with multiple tightly packed nuclei (c). Lower-grade tumor with a fine fibrillary matrix and cells exhibiting multiple tightly packed nuclei (d). An example of a tumor showing

perinuclear halos due to cytoplasmic clearing (e). Immunohistochemical staining for GFAP (f) and Olig2 (g) show strong positivity. Tumor cells infiltrate between axons stained for neurofilament protein (h). Scale bars: 200 μ m

tumors. Microvascular proliferation and necrosis were common across the majority of tumors, which mostly displayed a diffuse infiltrative pattern. Immunohistochemical analysis demonstrated immunoreactivity for OLIG2, with most cases showing diffuse positivity for GFAP (Fig. 2f, g). All analyzed tumors showed strong expression of vimentin, tested negative for synaptophysin and had restricted expression of CD34 to the vessels. Nuclear ATRX expression was preserved except in one case that harbored a nonsense variant (p.L389*). H3K27me3 was retained. Tumor cells enmeshed among axons stained for neurofilament protein, illustrating the infiltrative nature of the tumors (Fig. 2h). The Ki-67 labeling index varied between cases, with those displaying lower-grade features showing only 3–5% and higher-grade tumors showing up to 40% positivity on average (Supplementary Table 4, online resource).

In summary, our investigation has revealed a distinct subtype of adult-type diffuse astrocytoma through DNA methylation profiling, lacking both *IDH1/2* mutation or chromosome +7/-10 signature, but characterized by recurrent alterations within the MAPK pathway and with *TERT* promoter mutation in 25% of these neoplasms. Given the presence of targetable gene fusions within these tumors, RNA sequencing could be of value. While DNA methylation profiling has emerged as a pivotal tool in identifying novel CNS tumors, it is evident that sole reliance on epigenetic

signatures may not be adequate for establishing new tumor types. The histopathological and molecular overlap with IDH-wildtype glioblastoma indicates that recognizing these tumors as an entirely new tumor type is not justified at this stage. This also implies that currently DNA methylation profiling remains the primary method for identifying these tumors, similar to other epigenetically defined tumor types [3, 8]. However, the notable prevalence of targetable MAPK alterations and the slightly more favorable survival rate compared to typical IDH-wildtype glioblastomas suggest that recognizing these tumors, at least provisionally, as a molecular subtype of IDH-wildtype glioblastomas may be valuable. We suggest the term ‘diffuse high-grade astrocytoma, MAPK pathway-altered’ to describe this molecular subtype of tumors. Further accumulation of cases and data is necessary to substantiate this distinction and understand the full clinical implications.

Supplementary Information The online version contains supplementary material available at <https://doi.org/10.1007/s00401-024-02766-2>.

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Data availability The data that support the findings of this study are available from the corresponding author upon reasonable request.


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