



# Blood Biomarkers of Glioma in Response Assessment Including Pseudoprogression and Other Treatment Effects: A Systematic Review

Istafa J. Raza<sup>1\*</sup>, Campbell A. Tingate<sup>1</sup>, Panagiota Gkolia<sup>1</sup>, Lorena Romero<sup>2</sup>, Jin W. Tee<sup>1,3</sup> and Martin K. Hunn<sup>1,3</sup>

<sup>1</sup> Department of Neurosurgery, The Alfred Hospital, Melbourne, VIC, Australia, <sup>2</sup> The Ian Potter Library, The Alfred Hospital, Melbourne, VIC, Australia, <sup>3</sup> Department of Surgery, Faculty of Medicine, Nursing and Health Sciences, Monash University, Melbourne, VIC, Australia

#### **OPEN ACCESS**

#### Edited by:

Valeria Barresi, University of Messina, Italy

#### Reviewed by: Edjah K. Nduom,

National Institutes of Health (NIH), United States Simon Hanft, Rutgers, The State University of New Jersey, United States

> \*Correspondence: Istafa J. Raza i.raza@alfred.org.au

#### Specialty section:

This article was submitted to Neuro-Oncology and Neurosurgical Oncology, a section of the journal Frontiers in Oncology

> Received: 18 April 2020 Accepted: 12 June 2020 Published: 14 August 2020

#### Citation:

Raza IJ, Tingate CA, Gkolia P, Romero L, Tee JW and Hunn MK (2020) Blood Biomarkers of Glioma in Response Assessment Including Pseudoprogression and Other Treatment Effects: A Systematic Review. Front. Oncol. 10:1191. doi: 10.3389/fonc.2020.01191 Imaging-based monitoring of disease burden in glioma patients is frequently confounded by treatment effects. Circulating biomarkers could theoretically augment imaging-based response monitoring. This systematic review aimed to present and evaluate evidence for differential expression and diagnostic accuracy of circulating biomarkers with respect to outcomes of tumor response, progression, stable disease, and treatment effects (pseudoprogression, radionecrosis, pseudoresponse, and pseudolesions) in patients undergoing treatment for World Health Organization grades II-IV diffuse astrocytic and oligodendroglial tumors. MEDLINE, EMBASE, Web Of Science, and SCOPUS databases were searched until August 18, 2019, for observational or diagnostic studies on multiple circulating biomarker types: extracellular vesicles, circulating nucleic acids, circulating tumor cells, circulating proteins, and metabolites, angiogenesis related cells, immune cells, and other cell lines. Methodological quality of included studies was assessed using an adapted Quality Assessment of Diagnostic Accuracy Studies-2 tool, and level of evidence (IA-IVD) for individual biomarkers was evaluated using an adapted framework from the National Comprehensive Cancer Network guidelines on evaluating tumor marker utility. Of 13,202 unique records, 58 studies met the inclusion criteria. One hundred thirty-three distinct biomarkers were identified in a total of 1,853 patients across various treatment modalities. Fifteen markers for response, progression, or stable disease and five markers for pseudoprogression or radionecrosis reached level IB. No biomarkers reached level IA. Only five studies contained data for diagnostic accuracy measures. Overall methodological quality of included studies was low. While extensive data on biomarker dysregulation in varying response categories were reported, no biomarkers ready for clinical application were identified. Further assay refinement and evaluation in larger cohorts with diagnostic accuracy study designs are required.

#### PROSPERO Registration: CRD42018110658.

Keywords: glioma, circulating biomarkers, exosomes, circulating nucleic acids, circulating tumor cells, treatment effects, pseudoprogression, response assessment

1

# BACKGROUND

## **Treatment Effects in Glioma**

Glioma is the most common primary brain tumor, making up 25.5% of all central nervous system (CNS) malignancies, with an incidence of 25,000 new cases per year in the United States (1) and pooled global incidence of 3.38 per 100,000 person-years (2). Survival outcomes for high-grade glioma (HGG) remain very poor.

Follow-up of glioma patients during and after standard treatment can be confounded by treatment-related effects (TEs) that can mimic tumor progression (TP). Pseudoprogression (PsP) is a TE that typically occurs 3-6 months after chemoradiotherapy (CRTx), although delayed manifestation is possible, with an incidence of up to 36% in HGG (3). It is characterized by new enhancement or T2/fluid-attenuated inversion recovery (FLAIR) signal that stabilizes or reduces without salvage therapy (4). Radionecrosis is a term commonly used interchangeably with PsP and is a frequent pathological feature (5). Pseudoprogression can be symptomatic because of edema and mass effect. Immune checkpoint inhibitors have also been reported in trials to induce increased lesion size or "pseudolesions" (PsLs) (6, 7). Conversely, antiangiogenic treatments, such as the anti-vascular endothelial growth factor (VEGF) monoclonal antibody bevacizumab, can induce marked reduction in enhancement or FLAIR signal through reduction of vasogenic edema, in a phenomenon termed "pseudoresponse" (PsR), without necessarily improving overall survival (OS) (5, 8, 9).

To address TEs, Response Assessment in Neuro-Oncology (RANO) criteria for HGG assert that a diagnosis of TP cannot be made in the first 12 weeks after CRTx completion unless new enhancement is outside the radiation field or via repeat tissue diagnosis, regardless of symptom status (5).

# **Circulating Biomarkers in Glioma**

Circulating glioma biomarkers are a novel modality that could potentially augment response assessment. Scope exists for these to act as either triage tests or add-ons to standard imaging paradigms (**Figure 1**). There is also potential that circulating markers could be used in combination with novel imaging modalities such as magnetic resonance (MR) spectroscopy, positron emission tomography (PET), or MR perfusion to improve response assessment.

Several classes of circulating tumor biomarker have been reported (10–12). These can be broadly categorized into tumorderived extracellular vesicle (EV) biomarkers, circulating cellular biomarkers, circulating nucleic acids (CNAs), and circulating protein markers. Notably, EVs and cellular markers may act as vehicles for genetic and protein markers. Extracellular vesicles can be subdivided into exosomes derived from multivesicular bodies, and microparticles (MPs) or microvesicles (MVs) derived directly from cellular plasma membrane. Extracellular vesicles are enriched in glioma-associated macromolecules, such as nucleic acids, mutant oncoproteins, and angiogenic proteins (13).

Cellular markers include circulating tumor cells (CTCs) (14), circulating endothelial cells (CECs), and circulating endothelial progenitor cells (CEPs) (15), as well as changes to other circulating cells of hematopoietic lineage including neutrophils, monocytes, natural killer (NK) cells, lymphocytes, and platelets. Circulating tumor cells result from epithelial-to-mesenchymal transition and subsequent invasion into the bloodstream (16). Circulating endothelial cells and CEPs are related to angiogenic cascade activation, with CECs thought to be derived from mature vessel turnover, whereas CEPs are bone marrow derived, fueling neoangogenesis, and are phenotypically similar to hematopoietic stem cells (15). Both CEC and CEP counts are elevated in glioma patients (17, 18).

Glioma CNAs include (i) circulating tumor DNA (ctDNA), a subset of normal cell-free DNA (cfDNA) complement derived from necrotic or apoptotic tumor cells; (ii) micro-RNAs (miRNAs), which are small non-coding RNAs 19–22 nucleotides in length that are found in blood either complexed with Argonaute effector proteins or in lesser proportion packaged within EVs (13, 19–22); and (iii) long non-coding RNAs (lncRNAs), which are 200-nucleotide-long RNA transcripts (23).

# **Review Objectives**

The primary objective of this systematic review is to identify and compare circulating biomarkers that are differentially expressed in different treatment response categories of TP, tumor response (TR), stable disease (SD), and TEs. The secondary objective of this review is to evaluate diagnostic accuracy of these biomarkers in differentiating response categories.

# METHODS

# Literature Search Strategy and Selection Criteria

This systematic review was conducted according to PRISMA guidelines with preregistration of review protocol with the PROSPERO database in October 2018. To identify blood biomarkers, we searched literature databases MEDLINE, EMBASE, Web of Science, and Scopus to August 18, 2019, using MESH terms and keywords including "tumor progression," "tumor recurrence," "pseudoprogression," "treatment effects," "serum or blood or plasma markers," "miRNA," "ctDNA," "lncRNA," "extracellular vesicles," "circulating tumor cells," "circulating endothelial cells," and "circulating endothelial

Abbreviations: +LR, positive likelihood ratio; -LR, negative likelihood ratio; AUC, area under the curve; CEC, circulating endothelial cell; CEP, circulating endothelial progenitor; cfDNA, cell free DNA; CAN, Circulating nucleic acid; CR, complete response; CRTx, chemoradiotherapy; CTC, circulating tumor cell; ctDNA, circulating tumor DNA; CTx, chemotherapy; DC, dendritic cell; DOR, diagnostic odds ratio; EV, extracellular vesicles; GFAP, glial fibrillary acidic protein; HGG, high grade glioma; lncRNA, long-non-coding-RNA; LOE, level of evidence; NA, not-applicable; miRNA, micro-RNA; Mo-MDSC, monocytic myeloid derived suppressor cells; MP, microparticles; MV, microvesicles; NK, natural killer; NMR, nuclear magnetic resonance spectroscopy; OS, overall survival; PCT, prospective controlled trial; PR, partial response; PsP, pseudoprogression; QUADAS-2, Quality Assessment of Diagnostic Accuracy Studies-2; RTx, radiotherapy; SD, stable disease; Sn, sensitivity; Sp, specificity; TE, treatment-related effect; TP, tumor progression; TR, tumor response; RANO, response assessment in neuro-oncology.



applications in glioma diagnosis and treatment across disease course. Various imaging findings across this timeline present distinct diagnostic uncertainty. This review focuses on biomarkers in response assessment during conventional and trial treatments. CE, contrast enhancement; CRTx, chemoradiotherapy; CTx, chemotherapy; FLAIR, fluid-attenuated inversion recovery; m, months; Post-op, postoperative; PsP, pseudoprogression; PsR, pseudoresponse; PsL, pseudolesions; Rx, treatment.

progenitor cells" (detailed description of MEDLINE search in Table A1, Additional File 1).

We included any study on patients with histologically proven World Health Organization (WHO) grades II–IV diffuse astrocytic and oligodendroglial tumors that measured biomarker expression during or after adjuvant treatment and reported relevant outcomes as specified:

- For the primary objective, any measure of differential expression of biomarker at time of response categories of TR [including partial response (PR) and complete response (CR)], TP, SD, and any TEs including PsP, PsR, and PsL.
- For the secondary objective, any measure of the diagnostic accuracy of the biomarker in differentiating response categories including sensitivity (Sn), specificity (Sp), positive and negative likelihood ratios (+LR and -LR), diagnostic odds ratio (DOR), or area under the curve (AUC).

We did not place any limitation on reference standard for response classification, publication date, study design, or adjuvant treatment modality. When studies had overlapping cohorts, we included only the study with the largest cohort unless studies on smaller cohorts reported distinct biomarkers allowing inclusion for those biomarkers only. We excluded studies containing only WHO grade I glioma or those that included other CNS malignancies without analyzing outcomes in a glioma-only subgroup. Studies including WHO I glioma as part of a larger cohort with glioma of higher grades were included. We excluded studies where data were not extractable, pediatric populations, on cerebrospinal fluid (CSF), or other biofluid markers, or those unavailable in English. Studies published as abstracts were included if sufficient data were available for cohort size, histology, and outcome reporting. Outcomes defined by the histological finding of a pathological process other than tumor such as radiation necrosis or gliosis were treated as part of the clinical entity of PsP (5).

For inclusion, two authors (IR and PG) screened search results alongside references of relevant reviews with disagreements resolved by a third author (MH). Articles were excluded on title alone if it was clear that they were outside the inclusion criteria (e.g., review works, non-glioma, *in vitro*, animal, or pediatric studies). Abstracts were perused if deemed from the title that the study could theoretically include data related to the research question. Relevant full texts of articles were then perused unless the study could be excluded based on abstract alone.

## **Data Extraction and Management**

Data extraction was independently performed by two authors (IR and PG), with disagreements resolved by a third author (MH). Data were extracted into a standardized template, and included study characteristics were biomarker type, assay methodology, study design, size of glioma cohort in which biomarker was assayed, histology, treatment, relevant biomarker sampling timepoints, and reference standard. Any form of outcome data on differential expression in delineated response categories was reported. For studies that measured biomarkers at multiple timepoints, we extracted only those timepoints matched with reference standard. Diagnostic accuracy measures were calculated when not reported if adequate data were available. For studies including WHO I along with higher glioma grades that analyzed WHO II-IV glioma as separate subset(s), data on WHO I were excluded. Data on WHO I were included only if combined with cohorts including higher grades. Statistical measures were reported if available, taking p < 0.05 as cutoff for significance.

## Assessment of Methodological Quality

Two authors (IR and CT) independently appraised the methodological quality of included studies using an adapted Quality Assessment of Diagnostic Accuracy Studies-2 (QUADAS-2) tool (24) (**Table A2**, **Additional File 1**), with disagreements resolved by a third author (PG). For abstracts, study authors were contacted for further information to allow quality assessment. If authors did not respond, quality assessment of abstracts was not performed.

## Data Synthesis

Overall level of evidence (LOE) for individual biomarkers was appraised using an adapted framework in accordance with the National Comprehensive Cancer Network (NCCN) Task Force: Evaluating the Clinical utility of Tumor Markers in Oncology guidelines (25) (levels IA–IVD, **Table A3**, **Additional File 1**). Briefly, the index study for each biomarker was the positive study with the highest level study design. Other studies were used to evaluate consistency in data. Abstracts without adequate information to apply this framework were excluded from LOE analysis. Biomarkers with no positive outcome reported were rated as not applicable (NA).

Meta-analysis was not performed because of anticipated heterogeneity of included markers and outcomes. Reporting was stratified by biomarker subtype and treatment at time of biomarker sampling. Biomarker subtypes were divided into EV-derived, CNA, CTC, angiogenesis, and inflammation related proteins, circulating angiogenesis-related cells, immune and other circulating cell types, and other circulating proteins. Treatment subgroups were standard therapy [cytoreductive chemotherapy (CTx) +/- radiotherapy (RTx)], immunotherapy, antiangiogenic therapy, or combined therapy/other modalities/not specified.

# RESULTS

After screening a total of 13,202 non-duplicating published records, a total of 58 studies met the inclusion criteria consisting of 12 abstracts and 46 articles (**Figure 2**). The vast majority of *in vitro*, animal, and pediatric studies were excluded prior

to reaching full-text analysis. The major reasons for exclusion of full-text articles were if data on response related outcomes were not present (161 articles), or if biomarkers were in CSF or another biofluid (20 articles). One hundred thirty-three distinct biomarkers were identified and studied in a total of 1,853 patients with a mean sample size of 31 patients per study (range = 1– 343). Twenty-nine studies reported biomarker outcomes during standard treatment, eight studies during antiangiogenic therapy, four during immunotherapy modalities, and 20 under combined therapies/other/not specified. Characteristics of included studies are summarized in **Tables A4–10** (Additional File 2).

# Tumor Marker Subtypes

## Extracellular Vesicle–Derived Biomarkers

Five studies reporting 12 separate EV-derived biomarkers were identified (**Table A4**) (26–30). Alterations in EV count and expression profile at time of TP or TR were established in four studies. Total EV concentration was higher in glioblastoma (GBM) TP cases vs. postoperative cases (IB) (26). Similarly, MPs expressing glial fibrillary acidic protein (GFAP) and the procoagulant tissue factor were shown to rise during follow-up in TP but not SD cases after standard RTx + temozolomide (IIB) (27). Separately, using microfluidic chip



based immunomagnetic exosomal isolation coupled with micronucleic magnetic resonance spectroscopy (micro-NMR), Shao et al. (30) demonstrated higher "drug efficacy index" among TR cases compared to those without response to treatment with RTx + temozolomide +/- trial therapy in a prospective controlled trial (PCT) (IB). This index was calculated based on decreases in MV counts and reduction in MV expression of prototypical GBM oncoproteins epidermal growth factor receptor (EGFR), EGFRvIII, PDPN, and IDH1-R132H. In an example of therapyspecific monitoring, survivin-expressing exosomes were elevated in early but not late TP cases after trial vaccination with survivin epitope (IIB) (28). Only one study evaluated for differential expression in TP vs. PsP. Annexin V<sup>+</sup>/EGFR<sup>+</sup> MV counts were elevated in TP vs. PsP cases across multiple sampling timepoints matched to MR imaging (MRI) scans assessed via RANO criteria in a prospective cohort of 11 GBM patients (IB) (29).

### **Circulating Nucleic Acids**

Twelve studies reporting 19 different CNA biomarkers were identified (Table A5) (31-42). Among these, 14 were miRNAs. All were assayed using quantitative reverse transcription polymerase chain reaction (qRT-PCR). Two studies used an exosomal source comprising four miRNAs (32, 33). In three studies, miRNAs reached level IB evidence for association between altered circulating quantity and worsened disease status. miR-301a and miR-205 were elevated in GBM cases at time of TP vs. postoperatively in two separate longitudinal cohorts (32, 38). While the strength of these two studies was their prospective design, reference standard was not reported. In a separate study, miR-221 and miR-222 displayed sequentially elevated expression in worsening response categories CR, PR, SD, and TP (36). Two additional miRNAs (miR-21 and miR-124-3p) reached LOE IVD in case reports showing elevation prior to TP. Santangelo et al. reported a cumulative rise in a panel of three miRNAs; miR-21, miR-124-3p, and miR-222 2 months prior to confirmation of a case of GBM TP (33). Ilhan Mutlu et al. (31) also reported a single GBM case of miR-21 rise prior to TP. In notably conflicting findings, a study by Siegal et al. (35) reporting no correlation between change in miR-21 and miR-10b with response outcome as assessed by the RANO criteria in separate HGG cohorts treated with either temozolomide or bevacizumab.

For differential expression in PsP specifically, the highest LOE was IVD, incorporating seven miRNAs. A second case in the report by Santangelo et al. (33) showed cumulative miRNA decrease prior to PsP confirmation. Separately, Yang et al. (37) reported that 4 miRNAs initially discovered via high-throughput Solexa sequencing and validated with qRT-PCR, miR-150,-197,-23a, and-548-5p, were all elevated in PsP cases, when compared to WHO II, III, and IV glioma cohorts in preoperative blood samples. Diagnostic performance of the cumulative miRNA panel was high with AUC = 0.950 [95% confidence interval (CI), 0.902-0.998], but the main study limitation was cross-sectional design (37).

Four studies on circulating DNA were identified. Using a commercial next-generation sequencing platform, ctDNA mutation frequency was higher in cases demonstrating TP within <30 vs. >30 days of assay, with recruitment from an observational registry (IIIC) (39). Calculated diagnostic performance for TP <30 days was low, with Sn = 56%, Sp = 79%, +LR = 2.70, -LR = 0.55, DOR = 4.91 (39). Cordova et al. (42) reported a case series on IDH1 wild-type GBM in which presence and levels of C228T/C250T mutated TERT ctDNA, a mutation commonly demonstrated in diffuse glioma tissues, correlated with SD, TP, and PsP outcomes in selected patients (IVD). Total cfDNA, measured using fluorometric methods, was found to correlate with disease trajectory (TP or PsP) in two case series (IVD) (40, 41).

A single study on exosomal mRNA was identified, in which the Shao group demonstrated, using microfluidic qRT-PCR, that change in exosomal mRNA levels for DNA repair genes MGMT and APNG showed association with response status of TR, SD, or TP during treatment with temozolomide in case series (IVD) (34). No studies meeting inclusion criteria for lncRNAs were identified.

### **Circulating Tumor Cells**

Four studies met the inclusion criteria on glioma CTCs (**Table A6**) (43–46). Use of a microfluidic device with antibodies targeted at cancer markers SOX2, tubulin  $\beta$ 3, EGFR, A2B5, and c-MET ("STEAM" cocktail) detected CTC in 39% of GBM cases (46). In this cohort, the median CTC count in postoperative TP samples was higher than in those with SD (IIC) (46). Three reports using either serial culture, human telomerase probe, or polyploid chromosome 8 FISH also observed CTC rise with TP in HGG (43–45). Moreover, post-treatment CTC reduction was also demonstrated in PsP cases (IVD) (43, 44). Overall, CTC studies for response monitoring in HGG were limited by assay sensitivity and low sample size.

#### Angiogenic and Inflammatory Signaling Molecules

Forty-nine biomarkers within 15 studies were proteins related to angiogenic and inflammatory signaling cascades (Table A7) (47-61). The vast majority were detected using enzyme-linked immunosorbent assay (ELISA) or other immunoassay variants. Ten of 15 studies reporting biomarkers in this category involved treatment with an antiangiogenic agent either alone or in combination with other agents (52-57, 59-61). Antiangiogenic agents used in identified studies were bevacizumab, cediranib [a VEGF receptor (VEGFR) inhibitor], aflibercept [a VEGF and placental growth factor (PIGF) decoy receptor], vorinostat (a histone deacetylase inhibitor with antiangiogenic properties) and vandetanib (a VEGFR inhibitor). Six of 15 studies were PCTs on trial treatment with biomarkers as secondary outcomes (48, 51-53, 56, 59), and a further two studies relied on ancillary recruitment from trials (47, 55). Nine of 15 were on recurrent HGG populations (51-58, 61). The highest LOE biomarker was angiopoietin-2 (Ang2) (a proangiogenic growth factor) (IB), which showed increase at TP vs. two and four cycle timepoints during bevacizumab treatment in PCT (54). However, a similar finding for Ang2 was not observed in cediranib or vandetanib trial (52, 59).

At LOE IIB, biomarkers included the matrix metalloproteinases MMP2 and MMP9 and their endogenous inhibitor TIMP1. Notably, MMP9 was the subject of the largest

cohort study in this review by Iwamoto et al. (47), consisting of 343 glioma patients, which found no association between MMP9 levels and disease status in either low-grade glioma (LGG) or HGG. Likewise, MMP9 was not dysregulated at TP during bevacizumab + irinotecan for recurred HGG (61). However, MMP9 was found to be elevated with worsened response during aflibercept trial (53). Other biomarkers related to angiogenic signaling at IIB included proangiogenic growth factors VEGF-A, basic fibroblast growth factor, plateletderived growth factor, and PIGF, and circulating receptors sVEGFR1 and sTie2 (a serum angiopoietin receptor). Vascular endothelial growth factor-A is notable as it was the most frequently studied biomarker in this category, in a total of eight studies, with conflicting results. Association between TP and elevation in VEGF-A was reported during bevacizumab + irinotecan (57), as well as during intranasal monopterene perillyl alcohol trial therapy (58); however, the finding was not reflected in multiple other trials including two separate bevacizumab studies (54, 55), three other antiangiogenic agent trials (53, 56, 59), and one trial on cytoreductive temozolomide + thalidomide + celecoxib (48). Additional biomarkers at LOE IIB were the chemokines interleukin 8 and stromal cell derived factor  $1\alpha$ .

Two studies evaluated biomarkers from this class in PsP. During vantedanib trial, multiple biomarkers were shown not to be correlated with treatment response (ranking from better to worse CR, PR, SD, PsP, and TP) at timepoints matched with MRI follow-up (59). Interestingly, very early changes (within 4 h to 2 days) in three biomarkers (CA9, collagen IV, and sVEGFR2) were associated with eventual disease outcome; however, these were excluded from this analysis given the inappropriately long time interval between such changes and response assessment. A second study evaluating MMP2 and the inflammatory response protein NGAL did not find differential expression in PsP vs. TP (60).

## **Circulating Angiogenesis Related Cells**

Five studies reported on four separate circulating cell populations hypothesized to be involved in glioma angiogenesis and vessel turnover, assayed using FACS utilizing specific surface markers (Table A8) (52, 62-65). Cuppini et al. (62) reported changes in counts of five separate cell populations; three CEC subtypes (CECs overall, viable CECs, CD109<sup>+</sup> CECs), hematopoietic progenitor cells, and progenitor perivascular cells (IB). Notably, alterations in counts differed across response outcomes, as well as treatment modality. Bevacizumab + irinotecan induced reduction in counts of all colonies at 8 weeks posttreatment in those with either PR or SD but not TP. In those treated with bevacizumab alone, only the CD109<sup>+</sup> CEC population showed reduction in PR/SD cases but not TP. No changes were seen in a cohort treated with conventional cytoreductive temozolomide/fotemustine. To add to evidence for CEC correlation with response outcome during antiangiogenic modality, viable CEC counts were shown to rise concurrent with TP during cediranib PCT (64) and were elevated in TP vs. TR/SD at trial end for combined sorafenib + bevacizumab (65). Less evidence was found for CPC (IVD), whereby only one case of CPC rise at TP was reported (63). Additionally, no CPC variation was found at time of TP during cediranib treatment (52). No studies reported relationship of circulating angiogenesis-related cells and TEs.

# Alterations to Immune Related and Other Circulating Cell Populations

Thirty-seven biomarkers related to change in circulating immune cell and other hematopoietic lineage cells were reported in 14 studies (**Table A9**) (51, 55, 66–77). Six of these studies included treatment with dendritic cell (DC) vaccine immunotherapy with or without additional modalities (51, 71–73, 75, 77). Three studies involved bevacizumab treatment (55, 73, 74). Highest level of evidence (IIB) came from a PCT by Pellegatta et al. (73), where DC vaccine was used alongside conventional RTx/temozolomide in 24 patients with newly diagnosed GBM. Counts of CD8<sup>+</sup> T cells, CD4<sup>+</sup> T cells, and NK cells, as well as percentages of these cells expressing immune cell activation markers GZMB, ABCC3, and/or interferon  $\gamma$  (IFN- $\gamma$ ) were assayed. Selected subsets demonstrated elevation in cases maintaining TR/SD until 12-months follow-up without significant change in TP cases.

Case-level data were also found for higher frequency of immune responses in TR and SD vs. TP during DC vaccine (IVD). In a DC vaccine PCT, IFN-y response to epitope stimulation in peripheral mononuclear cells detected via ELISpot assay was more common at time of either TR or SD vs. time of TP (72). A separate DC vaccine did not show such a trend for IFN-y ELISpot; however, tetramer assay for antigen-specific CD8<sup>+</sup> T cells did reveal more common responses in TR or SD vs. TP at 9 weeks (77). In a study of a WT1 epitope-loaded DC vaccine, tetramer assay-verified WT1-specific CD8<sup>+</sup> T-cell responses were seen in 2 SD patients (75). During DC vaccine for recurrent GBM, TP was more common in those without epitope-specific cytotoxic CD8<sup>+</sup> T-cell responses, with diagnostic performance for lack of response as a tool to diagnose TP calculated as Sn = 83%, Sp = 55%, +LR = 1.88, -LR = 0.30, DOR = 6.27 (71).

Among studies on immunological markers, there was a comparatively high proportion of studies on utility for differentiating PsP from TP (5 of 14) (66-70). Four biomarkers in two studies reached LOE IB. In operative biopsy confirmed GBM vs. PsP samples, the preoperative percentage of monocytic myeloid-derived suppressor cells (Mo-MDSCs) with negative/low expression of MHCII class molecule HLA-DR (Mo-MDSC HLA-DR<sup>neg/low</sup>) was elevated, whereas the percentage expressing inflammation regulator VNN2 was reduced (69). The ratio of HLA-DR<sup>neg/low</sup> to VNN2 Mo-MDSCs (termed the DR-Vanin Index) was therefore higher in recurrent GBM vs. PsP cases. Three further LOE IB markers demonstrated by Parsa et al. were lower counts of activated NK2GD<sup>+</sup> NK cells and NK2GD<sup>+</sup> cytotoxic CD8<sup>+</sup> T cells and higher counts of activated CD25<sup>+</sup>FOXP3<sup>+</sup> regulatory T cells in TP cases vs. PsP cases (68). Differential neutrophil-lymphocyte ratio (NLR) was also identified in PsP vs. TP cases (LOE IIIC), with reduction of NLR associated with PsP cases post-RTx/temozolomide for GBM (67).

Diagnostic performance for NLR decrease to detect PsP was low, calculated at Sn = 59%, Sp = 67%, +LR = 1.85, -LR = 0.60, and DOR = 3.08 (67).

### **Other Circulating Proteins**

Eleven additional circulating proteins were identified in eight separate studies (Table A10) (55, 76, 78-83). One biomarker, YKL-40 glycoprotein, which has been implicated in glioma invasiveness (84), reached LOE IB. YKL-40 levels were lower in CR (disease absent) vs. PR/SD/TP cases (disease presence) for GBM and AA but not LGG in the Iwamoto group (78) cohort of 343 glioma cases. Diagnostic performance was, however low, with AUC (95% CI) of 0.65 (0.60-0.69) for anaplastic glioma and 0.65 (0.61-0.70) for GBM (78). Glial fibrillary acidic protein and a neural lineage marker NfL demonstrated elevation in TP vs. SD cases in a cross-sectional study (81); however, in a longitudinal study, only one of 18 cases showed GFAP elevation at TP, with GFAP remaining undetectable in the remainder (LOE IVD) (83). Serum autoantibodies to MGMT have also been reported in glioma, with increased epitope coverage and titer in TP cases (LOE IVD). A case series found no difference in expression of GFAP and other neural markers neurogranin, intercellular adhesion molecule-5, brain-derived neurotrophic factor, and Bsynuclein between recurrent GBM and PsP cases (80).

## **Quality Assessment of Individual Studies**

Quality assessment was performed for 50 studies in total (Figure 3 and Table A11, Additional File 3). Eight abstracts were excluded as authors did not respond with adequate information. Overall, studies predominantly had either high or

unclear risk of bias for three of four QUADAS-2 bias domains: patient selection, index test, and reference standard.

Notably, a high proportion of studies were either case reports or case series (15 in total), leading to high concerns for selection bias. In many studies, consecutive sampling was not specified leading to adjudgment of unclear risk of bias. In the index test domain, many studies lacked specific mention of blinding leading to unclear risk. A wide range of reference standards for response classification were used in these studies including imaging, histopathology, and multidisciplinary team consensus (Table 1). A large proportion of studies, 46%, were judged to have high concerns for bias in this domain. Twelve studies relied on the McDonald MRI criteria, which, unlike the latest RANO criteria, do not explicitly specify methods for exclusion of TEs (87). The RANO criteria were considered a robust classification standard. Seven studies involved histopathology as reference standard, which was considered low risk. Five studies utilized novel imaging techniques such as MR spectroscopy or PET as adjuncts to other tools. Many other studies failed to specify response assessment criteria leading to unclear risk.

In the flow and timing domain, a larger proportion of studies were judged to have low risk of bias (54%), which was due to widespread use of predefined imaging response assessment criteria and appropriate biomarker sampling timepoints. This was partly because several studies were clinical trials on novel glioma therapies, which built blood sampling concurrent with standard MRI follow-up into the study design. An inappropriately long interval between index test and reference standard, defined as 1 month or greater, was implicated in eight of 11 studies adjudged to have high risk of bias in this



#### TABLE 1 | Summary of response assessment reference standards used for studies in this systematic review.

| Reference<br>standard               | No. of<br>studies* | Strengths   | Limitations   | Likely to<br>correctly<br>classify |
|-------------------------------------|--------------------|---|---|------------------------------------|
| MRI-RANO<br>criteria                | 13                 | Clear guidelines on differentiating PsP and PsR<br>from other response outcomes<br>Specify criteria for diagnosing TP on histology<br>when imaging is equivocal<br>Most up-to-date consensus on glioma<br>response assessment | Retrospective conclusion about final response<br>outcome in equivocal cases can lead to<br>diagnostic delay<br>No criteria for PsLs | Yes                                |
| MRI—Macdonald<br>criteria           | 12                 | Specifically designed for glioma<br>Allows for inclusion and comparison of patients<br>evaluated prior to introduction of RANO  | ows for inclusion and comparison of patients In original form, no specific guidelines on  |                                    |
| MRI—RECIST<br>criteria              | 2                  | Nil for glioma  | r glioma Not specifically designed for glioma<br>No specific guidelines on excluding TEs<br>Superseded by glioma specific criteria  |                                    |
| MRI—WHO<br>criteria                 | 1                  | Nil for glioma Not specifically designed for glioma<br>No specific guidelines on excluding TEs<br>Superseded by RECIST criteria   |   | No                                 |
| MRI-criteria NOS                    | 13                 | N/A   | N/A   | Unclear                            |
| Histopathology                      | 7                  | Direct exclusion of confounding pathological<br>processes<br>When tissue sample adequate can act as gold<br>standard for definitive diagnosis<br>Risk of surgical and perioperative complications                             | cases in which diagnosis is uncertain<br>old Only has utility in patients undergoing<br>reoperation at TP                           |                                    |
| MR spectroscopy                     | 4                  | Potential for time of test diagnosis<br>Non-invasive<br>Useful add-on test in equivocal cases   | No standardized parameters for interpretation<br>Only moderate diagnostic performance in TP<br>vs. PsP (85)                         | Variable                           |
| PET imaging                         | 1                  | Potential for time of test diagnosis Non-invasive<br>Useful add-on tests in equivocal cases   | No standardized parameters for interpretation<br>Only moderate diagnostic performance in TP<br>vs. PsP (86)                         | Variable                           |
| Multidisciplinary<br>team consensus | 2                  | Can use multiple data sources<br>Reflects "real-world" diagnostic decisions   | Not standardized, significant between team<br>variation likely<br>Blinding harder to maintain                                       | Yes                                |
| Not specified                       | 5                  | N/A   | N/A   | Unclear                            |

\*Only studies included in quality assessment are counted. Some studies used more than one reference standard, either together or with variable reference standards for differing cases, in which case they are counted twice. Note that blinding was also taken into account for final risk of bias ratings for reference standard domain for individual studies, see **Table A11**.

domain, with time interval ranging from 1 to 4 months between biomarker sample and MRI. The remaining three studies with high risk of bias involved use of differing reference standards between patients.

# Summary of Findings and Levels of Evidence of Circulating Biomarkers

A total of 113 biomarkers within 46 studies had outcomes reported on differential expression in standard response categories of TP, TR, or SD (**Table 2**). Among these, 37 biomarkers were positive for differential expression in at least one response category, 28 had conflicting results and 48 were not found to have any differential expression in any response category. A total of 38 biomarkers within 14 studies had outcomes reported on differentiation of TP vs. PsP (**Table 2**). Among these, 19 biomarkers were positive (differential expression in TP vs. PsP), and 19 were negative. No studies reported biomarkers for PsL or PsR.

Only two studies reported diagnostic performance measures—one study for differentiation of CR (disease absence) vs. PR/SD/TP (disease presence) (YKL-40) and one study for differentiation of RN vs. active disease (miR-23a, miR-150, miR-197, and miR-548-5p). A further three studies reported data enabling calculation of diagnostic performance measures two on TP (ctDNA mutational frequency and T-cell response during immunotherapy) and one on TP vs. PsP (reduction in NLR).

Level of evidence ratings were performed for 133 biomarkers from 56 studies in total. Two abstracts were excluded from LOE analysis as inadequate information was available. For differential biomarker expression in TR, SD, or TP (**Table 3**), no biomarkers reached level IA, 15 reached IB, 27 reached IIB, 1 reached IIC, 4 reached IIIC, 18 reached IVD, and 49 TABLE 2 | Results and level of evidence ratings for biomarkers with differential expression in tumor progression, stable disease, and/or tumor response.

| Biomarker<br>subtype                | LOE  | Biomarker                  | Standard treatment         | Combination<br>therapy/others       | Immunotherapy | Anti-angiogenio<br>therapy |
|-------------------------------------|------|----------------------------|----------------------------|-------------------------------------|---------------|----------------------------|
| Extracellular<br>vesicle biomarkers | IB   | EV count                   | (+): (26, 27)              | (+): (30)                           |               |                            |
|                                     |      | MV count <sup>i</sup>      |                            | (+): (30)                           |               |                            |
|                                     |      | MV EGFR <sup>i</sup>       |                            | (+): (30)                           |               |                            |
|                                     |      | MV EGFRVIII <sup>i</sup>   |                            | (+): (30)                           |               |                            |
|                                     |      | MV PDPN <sup>i</sup>       |                            | (+): (30)                           |               |                            |
|                                     |      | MV IDH1-R132H <sup>i</sup> |                            | (+): (30)                           |               |                            |
|                                     | IIB  | Exosome count              |                            |                                     | (+): (28)     |                            |
|                                     |      | GFAP+ EVs                  | (+): (27)                  |                                     | (–): (28)     |                            |
|                                     |      | MP counts                  | (+): (27)                  |                                     |               |                            |
|                                     |      | SVN+ EVs                   |                            |                                     | (+): (28)     |                            |
|                                     |      | TF+ EVs                    | (+): (27)                  |                                     |               |                            |
| Circulating nucleic                 | IB   | miR-205                    | (+): (38)                  |                                     |               |                            |
| acids                               |      | miR-221                    | (+): (36)                  |                                     |               |                            |
|                                     |      | miR-222                    | (+): (33, 36)              |                                     |               |                            |
|                                     |      | miR-301a                   | (+): (32)                  |                                     |               |                            |
|                                     | IIIC | ctDNA (mutation frequency) |                            | (+): (39)                           |               |                            |
|                                     | IVD  | APNG mRNA                  | (+): (34)                  |                                     |               |                            |
|                                     |      | cfDNA (total)              |                            | (+): (40, 41)                       |               |                            |
|                                     |      | MGMT mRNA                  | (+): (34)                  |                                     |               |                            |
|                                     |      | miR-124-3p                 | (+): (33)                  |                                     |               |                            |
|                                     |      | miR-21                     | (–): (35)<br>(+): (31, 33) |                                     |               | (–): (35)                  |
|                                     | NA   | miR-10b                    | (–): (35)                  |                                     |               | (–): (35)                  |
| Circulating tumor cells             | IIC  | CTC                        | (+): (43–46)               |                                     |               |                            |
| Angiogenesis and inflammation       | IB   | Ang2                       |                            | (–): (59)                           |               | (–): (52)<br>(+): (54)     |
| related signaling<br>molecules      | IIB  | bFGF                       | (-): (48)                  | (–): (57, 59)                       |               | (–): (53)<br>(+): (52)     |
|                                     |      | IL-8                       |                            | (–): (57)<br>(+): (58)*             |               | (–): (53)<br>(+): (52)     |
|                                     |      | MMP2                       |                            | (+): (61)                           |               | (–): (52)                  |
|                                     |      | MMP9                       | (–): (47)                  | (–): (61)                           |               | (+): (24)                  |
|                                     |      | PDGF                       |                            | (–): (57)<br>(+): (56), (58)*       |               |                            |
|                                     |      | PIGF                       |                            | (–): (59)                           |               | (–): (53, 54)<br>(+): (52) |
|                                     |      | SDF1a                      |                            | (–): (59)                           |               | (–): (53)<br>(+): (52)     |
|                                     |      | sTie2                      |                            | (–): (59)                           |               | (–): (54)<br>(+): (52)     |
|                                     |      | sVEGFR1                    |                            | (–): (59)                           |               | (+): (52)                  |
|                                     |      | TIMP1                      | (–): (50)                  |                                     |               | (+): (53)                  |
|                                     |      | VEGF-A                     | (-): (48)                  | (–): (55, 56, 59)<br>(+): (57, 58)* |               | (–): (53, 54)              |
|                                     | IIIC | FVIII                      |                            |                                     |               | (+): (55)                  |
|                                     |      | IGFBP-2                    | (+): (49)                  | (–): (56)                           |               |                            |
|                                     |      | vWF                        |                            |                                     |               | (+): (55)                  |

(Continued)

### TABLE 2 | Continued

| Biomarker<br>subtype               | LOE | Biomarker                               | Standard treatment | Combination<br>therapy/others | Immunotherapy | Anti-angiogenic<br>therapy |
|------------------------------------|-----|---|--------------------|-------------------------------|---------------|----------------------------|
|                                    | NA  | Ang1                                    |                    |                               |               | (–): (52)                  |
|                                    |     | Angiogenin                              |                    | (–): (56)                     |               |                            |
|                                    |     | Angiostatin                             |                    | (–): (56)                     |               |                            |
|                                    |     | CA9                                     |                    | (–): (59)                     |               | (–): (53)                  |
|                                    |     | Collagen IV                             |                    | (–): (59)                     |               |                            |
|                                    |     | D-Dimer                                 |                    |                               |               | (–): (55)                  |
|                                    |     | Endostatin                              | (–): (48)          |                               |               |                            |
|                                    |     | F1+2                                    |                    | (–): (55)                     |               |                            |
|                                    |     | G-CSF                                   |                    | (–): (57)                     |               |                            |
|                                    |     | IGF-1                                   |                    | (–): (56)                     |               |                            |
|                                    |     | IGF-1 sR                                |                    | (–): (56)                     |               |                            |
|                                    |     | IGF-2                                   |                    | (–): (56)                     |               |                            |
|                                    |     | IGFBP-1                                 |                    | (–): (56)                     |               |                            |
|                                    |     | IGFBP-3                                 |                    | (–): (56)                     |               |                            |
|                                    |     | IGFBP-4                                 |                    | (–): (56)                     |               |                            |
|                                    |     | IGFBP-5                                 |                    | (–): (56)                     |               |                            |
|                                    |     | IGFBP-6                                 |                    | (–): (56)                     |               |                            |
|                                    |     | IL-1β                                   |                    |                               |               | (–): (52)                  |
|                                    |     | IL-6                                    |                    |                               |               | (–): (52, 53)              |
|                                    |     | IL-12                                   |                    | (-): (57)                     |               |                            |
|                                    |     | IL-13                                   |                    | (–): (51)<br>(–): (57)        |               |                            |
|                                    |     | IL-17                                   |                    | (-): (57)                     |               |                            |
|                                    |     | MIP-1β                                  |                    | (-): (57)                     |               | (): (53)                   |
|                                    |     | MMP10                                   |                    | ( ). (0.)                     |               | (-): (52)                  |
|                                    |     | PAI-1                                   |                    | (–): (55)                     |               | ( ). (02)                  |
|                                    |     | SCGFβ                                   |                    | ( ). (00)                     |               | (): (53)                   |
|                                    |     | sVEGFR2                                 |                    | (–): (56)                     |               | (-): (53)                  |
|                                    |     |   |                    | (-): (59)                     |               | ( ). (00)                  |
|                                    |     | sVEGFR3                                 |                    | (–): (56)                     |               |                            |
|                                    |     | TAT                                     |                    | (–): (55)                     |               |                            |
|                                    |     | TGFα                                    |                    |                               |               | (–): (52)                  |
|                                    |     | TSP-1                                   | (–): (48)          |                               |               |                            |
|                                    |     | VEGF-C                                  |                    | (–): (56)                     |               |                            |
|                                    |     | VEGF-D                                  |                    | (–): (56)                     |               |                            |
| Angiogenesis<br>elated circulating | IB  | CEC (CD 109+/viable<br>CEC/overall CEC) | (-): (62)          | (+): (62)                     |               | (+): (62, 64, 65)          |
| ells                               |     | HPC                                     | (–): (62)          | (+): (62)                     |               | (–): (62)                  |
|                                    |     | PPC                                     | (–): (62)          | (+): (62)                     |               | (–): (62)                  |
|                                    | IVD | CPC                                     | (–): (62)          | (–): (62) (+): (63)           |               | (–): (52, 62, 64)          |
| Alterations to                     | IIB | NK cells ABCC3+                         |                    | (+): (73)                     |               |                            |
| mmune related<br>and other         |     | NK cells CD56 dim                       |                    | (+): (73)                     |               |                            |
| circulating cell                   |     | NK cells GZMB+                          |                    | (+): (73)                     |               |                            |

(Continued)

#### TABLE 2 | Continued

| Biomarker<br>subtype | LOE | Biomarker                       | Standard treatment | Combination<br>therapy/others | Immunotherapy | Anti-angiogenic<br>therapy |
|----------------------|-----|---------------------------------|--------------------|-------------------------------|---------------|----------------------------|
|                      |     | Lymphocytes                     |                    | (–): (55)                     |               |                            |
|                      |     |                                 |                    | (+): (73)                     |               |                            |
|                      |     | PBL ABCC3                       |                    | (+): (73)                     |               |                            |
|                      |     | PBL IFN-γ                       |                    | (–): (51) (+): (73)           |               |                            |
|                      |     | T-cells CD4+ ABCC3+             |                    | (+): (73)                     |               |                            |
|                      |     | T-cell CD4+ IFN-γ+              |                    | (+): (73)                     |               |                            |
|                      |     | T-cell CD4+                     |                    | (+): (73)                     |               |                            |
|                      |     | T-cell CD8+                     |                    | (–): (51)<br>(+): (73, 75)    |               |                            |
|                      | IVD | Monocytes                       |                    | (+): (74)                     |               |                            |
|                      |     | Mononuclear cells IFN- $\gamma$ |                    | (–): (77)<br>(+): (72)        |               |                            |
|                      |     | Neutrophils                     |                    | (–): (55)<br>(+): (74, 76)    |               |                            |
|                      |     | T-cell CD4+:CD8+ ratio          |                    | (+): (74)                     |               |                            |
|                      |     | T-cells CD8+ antigen specific   |                    | (+): (75, 77)                 | (+): (71)*    |                            |
|                      |     | PBL E4BP4                       |                    | (+): (51)                     |               |                            |
|                      |     | Platelets                       |                    | (–): (55)<br>(+): (76)        |               |                            |
|                      |     | WCC                             |                    | (-): (74) (+): (76)           |               |                            |
|                      | NA  | B-cells                         |                    | (): (74)                      |               |                            |
|                      |     | Dendritic cells                 |                    | (): (74)                      |               |                            |
|                      |     | Eosinophils                     |                    | (–): (74)                     |               |                            |
|                      |     | Leukocytes                      |                    | (–): (74)                     |               |                            |
|                      |     | MPV                             |                    | (–): (55)                     |               |                            |
|                      |     | NK cells                        | (–): (70)          | (): (51, 73, 74)              |               |                            |
|                      |     | NK cells CD56 bright            |                    | (): (73)                      |               |                            |
|                      |     | PBL granzyme B                  |                    | (–): (51)                     |               |                            |
|                      |     | PDW                             |                    | (–): (55)                     |               |                            |
|                      |     | T-cells CD8+ ABCC3+             |                    | (-): (73)                     |               |                            |
|                      |     | T-cells CD8+ GZMB+              |                    | (-): (73)                     |               |                            |
|                      |     | T-cells CD8+ IFN-γ+             |                    | (-): (73)                     |               |                            |
| Other protein        | IB  | YKL-40                          | (+): (78)          |                               |               |                            |
| biomarkers           | IVD | GFAP                            |                    | (–): (83)<br>(+): (81)        |               |                            |
|                      |     | MGMT Autoantibodies             | (+):(79)           | ( ) / (- · /                  |               |                            |
|                      |     | Hemoglobin                      |                    | (–): (55)<br>(+): (76)        |               |                            |
|                      |     | NfL                             |                    | (+): (81)                     |               |                            |
|                      | NA  | Recoverin                       |                    | (-): (82)                     |               |                            |
|                      |     | Tau protein                     |                    | (-): (81)                     |               |                            |

(+), positive finding; (–), negative finding; ABCC3, ATP binding cassette subfamily C member 3; Ang, angiopoeitin; APNG, alkylpurine DNA n-glycosylase; bFGF, basic fibroblast growth factor; CA9, carbonic anhydrase 9; CD, cluster of differentiation; CEC, circulating endothelial cell; cfDNA, cell-free DNA; CTC, circulating tumor cells; CPC, circulating progenitor cell; ctDNA, circulating tumor DNA; EGFR, epidermal growth factor receptor; EGFRvIII, EGFR variant III mutation; EV, extracellular vesicles; F1+2, prothrombin fragment 1+2; FVIII, factor VIII; G-CSF; granuocyte colony stimulating factor; GFAP, glial fibrillary acidic protein; GZMB, granzyme b; HPC, haematopoetic progenitor cells; IDH-R132H, cytosolic isocitrate dehydrogenase 1 mutation; IGF, insulin like growth factor; IGFPBP, insulin like growth factor binding protein; 1β, interfevini; IFN, interferon; LOE, level of evidence rating; MGMT, O-6-methyl-guanine-DNA-methyl-transferase; MIP-1β, macrophage inflammatory protein-1β; miR, microPNA; MMP, matrix metalloproteinase; MP, microparticle; MPV, mean platelet volume; PBL, peripheral blood lymphocytes; PDGF, platelet derived growth factor; NGAL, neutrophil gelatinase-associated lipocalin; NK, natural killer; PAI-1, plasminogen activator inhibitor-1; PBL, peripheral blood lymphocytes; PDGF, platelet derived growth factor 1α; STE2, soluble Tie-2; sVEGFR, soluble VEGF receptor; SVN, survivin; TAT, thrombin-antithrombin complexes; TF, tissue factor; TGF- α, transforming growth factor α; TIMP1, tissue inhibitor of matrix metalloproteinase 1; TSP-1, thrombospondin 1; VEGF, vascular endothelial growth factor; WF, von Willebrand Factor; WCC, white cell count; YKL-40, chitinase 3-like 1 glycoprotein.

\*Abstract for ref. (58) included in LOE analysis as insufficient information available.

<sup>i</sup>These biomarker were incorporated into a drug efficacy index, see **Table A4** for further details.

were not rated (NA). For differential expression in TP vs. PsP (**Table 2**), no biomarkers reached IA, 5 reached IB, none reached IIB, none reached IIIC, 10 reached IVD, and 23 were not rated (NA).

## DISCUSSION

Different biomarker subtypes present unique strengths and limitations in glioma response monitoring potential (summarized in Table 4). Exosomal markers stood out because of the host of tumor-related information accessible through a single platform, most evident in microfluidic isolation studies by Shao et al. (30, 34). In addition to promising response-related findings, micro-NMR was also able to achieve high diagnostic accuracy in differentiation of GBM and healthy controls prior to treatment (Sn = 92%, Sp = 88%, AUC = 0.95) (30). The ability to leverage tumor-specific information carried in EVs through ultrasensitive assay techniques can focus on the likely small subset of circulating EVs that are truly tumor-derived, increasing the specificity of detected changes to tumor level events. Novel assays that couple biomarker extraction and quantification steps together such as chip-based approaches may reduce turnaround times to clinical answers but, at present are limited by cost and availability. In other molecular biomarker classes, only among miRNAs did assay methodologies specifically focus on EVs as a biomarker vehicle, with other molecular biomarkers in this review isolated directly from serum or plasma samples. Wider application of EV-based assays may improve performance of alternative molecular classes.

Early findings on CNAs in glioma are promising but face barriers. Studies on miRNA were limited by low patient numbers in response assessment analyses. Many miRNA studies were focused on diagnostic performance of biomarkers in GBM vs. healthy controls at baseline, but only small subsets of patients were followed up posttreatment, precluding assessment of diagnostic accuracy for response outcomes. With meta-analyses establishing potential of miRNAs in diagnosis of GBM vs. healthy controls enabled by well-designed studies for this question (88-91), the impetus exists for larger studies to further assess their potential role in monitoring. Circulating tumor DNA and cfDNA studies were likewise limited by small cohorts, consisting predominantly of case series. One potential advantage of ctDNA is its rapid plasma clearance, with a study in colorectal cancer demonstrating estimated plasma half-life of <1.5 h, making it theoretically more likely to reflect disease status at time of assay (92). Circulating tumor DNA levels in glioma cases are, however, among the lowest in all cancers (93). This could be mitigated through size-selected sequencing, with evidence that ctDNA occupies the 90- to 150-bp fragment size range compared with normal cfDNA at 160 bp, with size selection markedly increasing ctDNA yield in GBM and improving diagnostic accuracy vs. controls (94, 95).

The multitude of angiogenesis- and inflammation-related proteins with positive findings in this review raises significant questions. Inconsistency in findings between studies strongly suggests that these biomarkers may be markers of bioactivity of antiangiogenic agents rather than direct indicators of changes in the tumor tissue. Alterations in biomarkers at TP may reflect escape mechanisms via angiogenic cascades not inhibited by the trial agent. Alternatively, changes in such markers may only be meaningful in the context of a therapeutic agent that directly targets signaling pathways in which they are involved. An ideal angiogenic biomarker would reflect TP-associated increase in neoangiogenesis independent of treatment context. Regardless, given that antiangiogenesis-induced normalization of tumor vasculature presents a significant imaging conundrum, several markers here identified represent candidates for future study in targeted trials.

Among cellular biomarkers, in the case of CTCs, there have been progressive improvements in detection sensitivity, with the highest incidence reported at 77% of WHO II-IV patients (43). At present, however, this level of sensitivity is evidently limiting for universal application of this marker. For CECs, evidence suggests that treatment-related changes may be restricted to antiangiogenic treatment modalities. Circulating endothelial cell fluctuations may arise from direct insults from such treatment on recruitment pathways from bone marrow. A further difficulty with CECs is that there is little consensus on the definition of cell surface markers used for their isolation (15), with a strong possibility that differential phenotypic and functional properties of CECs isolated in different studies may explain heterogeneous findings in treatment monitoring. CD109 was a membrane protein selectively overexpressed in blood vessels during tumor angiogenesis in colon, lung, and breast tumors (96); thus, CD109 CECs may identify a tumor-specific population (62). Further work is required to delineate a high-fidelity CEC subpopulation that reflects GBM status.

Emerging focus on differences in immune profile as indicators of tissue level changes in GBM is promising. Pseudoprogression likely either induces or is partly driven by distinct immunological events that are reflected in the immune cell profile in peripheral blood. Taken together, Parsa et al. (68) and Soler et al. (69) suggest that assessing the balance between proinflammatory and immunosuppressive cell lineages in peripheral blood may be a clinically useful approach that deserves further exploration. The second facet of leveraging immune system changes is their potential for monitoring patients undergoing active vaccination. An ability to define responders via epitope specific assays could guide decisions on vaccine continuation or early switch to a different modality. The limitation is that epitope-specific assays are therapy specific and not generalizable.

One limitation of this review is that we did not search gray literature or include studies not available in English, which theoretically increased the risk of incomplete retrieval. There was also a paucity of studies with diagnostic design for the clinical question of interest, combined with a large proportion of studies with low methodological quality. It is emphasized that LOE gradings were based on evidence for the differential expression of biomarkers in question and not their diagnostic application. We decided against application of the GRADE

#### TABLE 3 | Results and levels of evidence ratings for biomarkers with differential expression in TP vs PsP.

| Biomarker subtype                   | LOE  | Biomarker                      | Standard treatment | Combination<br>therapy/others | Immunotherapy | Anti-angiogenic<br>therapy |
|-------------------------------------|------|--------------------------------|--------------------|-------------------------------|---------------|----------------------------|
| Extracellular vesicle<br>biomarkers | IB   | EGFR+ MV count                 |                    | (+): (29)                     |               |                            |
| Circulating nucleic acids           | IVD  | cfDNA (total)                  |                    | (+): (41)                     |               |                            |
|                                     |      | miR-124-3p                     | (+): (33)          |                               |               |                            |
|                                     |      | miR-150                        | (+): (37)          |                               |               |                            |
|                                     |      | miR-197                        | (+): (37)          |                               |               |                            |
|                                     |      | miR-21                         | (+): (33)          |                               |               |                            |
|                                     |      | miR-222                        | (+): (33)          |                               |               |                            |
|                                     |      | miR-23a                        | (+): (37)          |                               |               |                            |
|                                     |      | miR-548-5p                     | (+): (37)          |                               |               |                            |
|                                     |      | TERT ctDNA mutation            | (+): (42)          |                               |               |                            |
|                                     | NA   | miR-133a                       | (–): (37)          |                               |               |                            |
|                                     |      | miR-15b                        | (–): (37)          |                               |               |                            |
|                                     |      | miR-497                        | (–): (37)          |                               |               |                            |
| Circulating tumor cells             | IVD  | CTC                            | (+): (43, 44)      |                               |               |                            |
| Angiogenesis and                    | NA   | Ang2                           | (): (59)           |                               |               |                            |
| nflammation related                 |      | CA9                            | (–): (59)          |                               |               |                            |
| signaling molecules                 |      | Collagen IV                    | (–): (59)          |                               |               |                            |
|                                     |      | bFGF                           | (–): (59)          |                               |               |                            |
|                                     |      | MMP2                           | (–): (60)          |                               |               |                            |
|                                     |      | NGAL                           | (): (60)           |                               |               |                            |
|                                     |      | PIGF                           | (–): (59)          |                               |               |                            |
|                                     |      | SDF1a                          | (–): (59)          |                               |               |                            |
|                                     |      | sTie2                          | (–): (59)          |                               |               |                            |
|                                     |      | sVEGFR1                        | (–): (59)          |                               |               |                            |
|                                     |      | sVEGFR2                        | (–): (59)          |                               |               |                            |
|                                     |      | VEGF                           | (–): (59)          |                               |               |                            |
| Alterations to immune               | IB   | Mo-MDSC <sup>i</sup>           | (+): (69)          |                               |               |                            |
| elated and other circulating        |      | NK-cells CD3+NK2GD+            | (+): (68)          |                               |               |                            |
| cell populations                    |      | Tc-cells CD8+NK2GD+            | (+): (68)          |                               |               |                            |
|                                     |      | Treg-cells<br>CD4+FoxP3+CD25+  | (+): (68)          |                               |               |                            |
|                                     | IIIC | Neutrophil to lymphocyte ratio | (+): (67)          |                               |               |                            |
|                                     | NA   | Lymphocytes                    | (–): (66)          |                               |               |                            |
|                                     |      | NK cells                       | (–): (70)          |                               |               |                            |
| Other protein biomarkers            | NA   | BDNF                           | (–): (80)          |                               |               |                            |
|                                     |      | B-syn-nuclein                  | (–): (80)          |                               |               |                            |
|                                     |      | GFAP                           | (–): (80)          |                               |               |                            |
|                                     |      | ICAM-5                         | (–): (80)          |                               |               |                            |
|                                     |      | Neurogranin                    | (): (80)           |                               |               |                            |

(+), positive finding; (-), negative finding; Ang, angiopoeitin; BDNF, brain derived neurotrophic factor; bFGF, basic fibroblast growth factor; CA9, carbonic anhydrase 9; CD, cluster of differentiation; cfDNA, cell-free DNA; CTC, circulating tumor cells; EGFR, epidermal growth factor receptor; FoxP3, forkhead box P3; GFAP, glial fibrillary acidic protein; ICAM-5, Intercellular adhesion molecule 5; LOE, level of evidence rating; miR, microRNA; MMP, matrix metalloproteinase; Mo-MDSC, monocyte myeloid-derived suppressor cell; MV, microvesicle; NGAL, neutrophil gelatinase-associated lipocalin; NK, natural killer; NKG2D, natural killer group 2D; PIGF, placental growth factor; SDF1α, stromal cell derived factor 1α; sTie2, soluble Tie-2; sVEGFR, soluble VEGF receptor; Tc, cytotoxic T cells; TERT, telomerase reverse transcriptase; Treg, regulatory T cells; VEGF, vascular endothelial growth factor; <sup>1</sup>Mo-MDSC HLA-DR and Vannin 2 expression were combined in an index known as DR-Vannin index (DVI), see **Table A9** for more details.

| Biomarker class  | Highest LOE<br>rating for TP, SD,<br>and/or TR | Highest LOE<br>Rating for TP vs.<br>PSP | Strengths   | Limitations  | Strategies for future<br>clinical application   |
|--|--|---|---|--|---|
| Extracellular<br>vesicle biomarkers  | ΙB   | ΙB                                      | Specificity to glioma<br>High sensitivity assays exist<br>Chip based assays can<br>couple several analytical<br>steps reducing<br>turnaround time | Require novel and<br>expensive high sensitivity<br>assays with limited<br>availability   | Application to larger cohorts<br>with diagnostic study<br>designs<br>Application of exosomal<br>protein-based assays to TP<br>vs. PsP                       |
| Circulating nucleic<br>acids   | IB   | WD                                      | Short half-life reflects real<br>time tumor status qPCR<br>techniques allow fast assay<br>turnaround  | Low case numbers for<br>treatment monitoring<br>studies<br>ctDNA sensitivity limited   | miRNAs: application to<br>larger cohorts with<br>diagnostic study designs<br>ctDNA: higher sensitivity<br>assays<br>High-throughput<br>sequencing platforms |
| Circulating tumor cells  | IIC  | IVD                                     | Specificity to glioma   | Sensitivity limited<br>Prolonged turnaround time<br>due to complexity<br>in isolation  | Application to larger cohorts<br>with diagnostic study<br>designs<br>Improvement of<br>isolation techniques   |
| Angiogenesis- and<br>inflammation-<br>related signaling<br>molecules             | IB   | NA                                      | High methodological quality<br>of studies<br>ELISA techniques allow fast<br>assay turnaround  | Treatment modality specific<br>Conflicting evidence  | Diagnostic study designs<br>Further studies during<br>conventional CRTx   |
| Angiogenesis-<br>related circulating<br>cells                                    | IB   | NA                                      | _   | Unclear definitions of key<br>cell populations<br>FACS-based assays<br>increase turnaround time<br>Treatment modality specific | Further studies to define<br>tumor-specific cell<br>populations   |
| Alterations to<br>immune-related<br>and other<br>circulating cell<br>populations | IB   | ΙB                                      | Evidence indicates stronger<br>potential in TP vs. PsP<br>May reflect pathological<br>processes in PsP  | Likely to be affected by<br>co-existing immune<br>modulating therapies or<br>disorders   | Further studies to define<br>immune aberrations of<br>interest<br>Application to larger cohorts<br>with diagnostic<br>study designs                         |
| Other protein<br>biomarkers  | IB   | NA                                      | Large cohort sizes<br>ELISA techniques allow fast<br>assay turnaround   | Limited sensitivity and specificity of initially promising candidates  | Discovery studies with<br>higher-throughput screening   |

TABLE 4 | Summary of evidence for biomarker classes in this systematic review including strengths, limitations, and pathways for future clinical application.

NA, not applicable.

criteria for diagnostic studies in appraisal, as these present significant limitations in applicability to assessing evidence on differential expression alone due to reliance on diagnostic accuracy data to ascertain inconsistency, as well as imprecision of evidence (97). The NCCN criteria allowed for broader assessment of clinical utility across a range of study designs, however, do not incorporate risk-of-bias assessment into LOE ratings to the same degree as GRADE; nor are they specifically designed to give consensus recommendations (25). It should also be noted that, as final glioma response classification is often only possible retrospectively, an appropriate interval between index test and reference standard is difficult to determine. While a 1-month cutoff was used for quality assessment in this review, it is emphasized that concurrent biomarker sampling and reference standard application are preferable to avoid misclassification biases, because of potential for disease status change in the delay between assay and imaging or biopsy.

## CONCLUSION

Based on this review, no biomarkers are yet ready for clinical application either as triage tests or add-on tests to the current GBM monitoring paradigm. Future studies must employ multistage verification. A marker should first be reliably detectable and specific to glioma. It follows therefore that the marker should perform strongly at distinguishing gliomabearing patients from healthy controls. This is a precondition to diagnostic performance differentiating disease presence or progression from treatment-related phenomena, a process calling for higher levels of specificity owing to confounding pathological processes. At this stage, while circulating marker diagnosis of glioma vs. healthy controls accrues mounting experimental evidence, follow-through into monitoring phases of studies is characterized by attrition in patient numbers and methodological quality, as shown in this review. Novel sensitive assay techniques that leverage multiple bioinformatics sources in a single assay such as high-throughput microfluidic platforms or sequencing platforms likely hold the greatest potential. The possibility of using analysis of circulating immune cells to distinguish PsP from TP deserves further investigation.

## DATA AVAILABILITY STATEMENT

The original contributions presented in the study are included in the article/**Supplementary Material**, further inquiries can be directed to the corresponding author/s.

## **AUTHOR CONTRIBUTIONS**

IR wrote the protocol, screened searches and articles, performed data extraction, performed quality assessment, and wrote the manuscript. CT performed quality assessment. PG screened

## REFERENCES

- Ostrom QT, Gittleman H, Liao P, Vecchione-Koval T, Wolinsky Y, Kruchko C, et al. CBTRUS statistical report: primary brain and other central nervous system tumors diagnosed in the United States in 2010–2014. *Neuro Oncol.* (2017) 19:v1–88. doi: 10.1093/neuonc/nox158
- de Robles P, Fiest KM, Frolkis AD, Pringsheim T, Atta CC, St Germaine-Smith, et al. The worldwide incidence and prevalence of primary brain tumors: a systematic review and meta-analysis. *Neuro Oncol.* (2015) 17:776– 83. doi: 10.1093/neuonc/nou283
- Abbasi AW, Westerlaan HE, Holtman GA, Aden KM, van Laar PJ, van der Hoorn A. Incidence of tumour progression and pseudoprogression in highgrade gliomas: a systematic review and meta-analysis. *Clin Neuroradiol.* (2017) 28:401–11. doi: 10.1007/s00062-017-0584-x
- Belliveau J-G, Bauman G, Macdonald DR. Detecting tumor progression in glioma: current standards and new techniques. *Expert Rev Anticancer Ther.* (2016) 16:1177–88. doi: 10.1080/14737140.2016.1240621
- Wen PY, Macdonald DR, Reardon DA, Cloughesy TF, Sorensen AG, Galanis E, et al. Updated response assessment criteria for high-grade gliomas: response assessment in neuro-oncology working group. *J Clin Oncol.* (2010) 28:1963– 72. doi: 10.1200/JCO.2009.26.3541
- Huang RY, Neagu MR, Reardon DA, Wen PY. Pitfalls in the neuroimaging of glioblastoma in the era of antiangiogenic and immuno/targeted therapy—detecting illusive disease, defining response. *Front Neurol.* (2015) 6:33. doi: 10.3389/fneur.2015.00033
- Okada H, Weller M, Huang R, Finocchiaro G, Gilbert MR, Wick W, et al. Reardon: immunotherapy response assessment in neuro-oncology: a report of the RANO working group. *Lancet Oncol.* (2015) 16:e534– 42. doi: 10.1016/S1470-2045(15)00088-1
- Brandsma D, van den Bent MJ. Pseudoprogression and pseudoresponse in the treatment of gliomas. *Curr Opin Neurol.* (2009) 22:633– 8. doi: 10.1097/WCO.0b013e328332363e
- Chang JH, Kim CY, Choi BS, Kim YJ, Kim JS, Kim IA. Pseudoprogression and pseudoresponse in the management of high-grade glioma: optimal decision timing according to the response assessment of the neuro-oncology working group. J Korean Neurosurg Soc. (2014) 55:5–11. doi: 10.3340/jkns.2014. 55.1.5
- Zachariah MA, Oliveira-Costa JP, Carter BS, Stott SL, Nahed V. Blood-based biomarkers for the diagnosis and monitoring of gliomas. *Neuro Oncol.* (2018) 20:1155–61. doi: 10.1093/neuonc/noy074
- Verduin M, Compter I, Steijvers D, Postma AA, Eekers DBP, Anten MM, et al. Noninvasive glioblastoma testing: multimodal approach to monitoring and predicting treatment response. *Dis Markers*. (2018) 2018:2908609. doi: 10.1155/2018/2908609

searches and articles, performed data extraction, verified quality assessment, and was a major contributor to the manuscript. LR formulated searches. JT was a major contributor to the protocol, methodology, and design of the paper. MH screened articles, verified data extraction, and was a major contributor the manuscript. All authors read and approved the final manuscript.

## SUPPLEMENTARY MATERIAL

The Supplementary Material for this article can be found online at: https://www.frontiersin.org/articles/10.3389/fonc. 2020.01191/full#supplementary-material

Additional File 1 | Search strategy, adapted QUADAS-2 scale, and adapted NCCN framework for evaluating clinical utility of biomarkers.

Additional File 2 | Characteristics tables for all studies stratified by biomarker subtype.

Additional File 3 | Results of quality assessment for each individual study.

- Best MG, Sol N, Zijl S, Reijneveld JC, Wesseling P, Wurdinger T. Liquid biopsies in patients with diffuse glioma. *Acta Neuropathol.* (2015) 129:849– 65. doi: 10.1007/s00401-015-1399-y
- Skog J, Wurdinger T, van Rijn S, Meijer DH, Gainche L, Sena-Esteves M, et al. Breakefield: glioblastoma microvesicles transport RNA and proteins that promote tumour growth and provide diagnostic biomarkers. *Nat Cell Biol.* (2008) 10:1470–6. doi: 10.1038/ncb1800
- Muller C, Holtschmidt J, Auer M, Heitzer E, Lamszus K, Schulte A, et al. Riethdorf: hematogenous dissemination of glioblastoma multiforme. *Sci Transl Med.* (2014) 6:247ra101. doi: 10.1126/scitranslmed.3009095
- Bertolini F, Shaked Y, Mancuso P, Kerbel RS. The multifaceted circulating endothelial cell in cancer: towards marker and target identification. *Nat Rev Cancer.* (2006) 6:835–45. doi: 10.1038/nrc1971
- Chistiakov DA, Chekhonin VP. Circulating tumor cells and their advances to promote cancer metastasis and relapse, with focus on glioblastoma multiforme. *Exp Mol Pathol.* (2018) 105:166–74. doi: 10.1016/j.yexmp.2018.07.007
- Reynés G, Vila V, Fleitas T, Reganon E, Font de Mora J, Jordá M, et al. Circulating endothelial cells and procoagulant microparticles in patients with glioblastoma: prognostic value. *PLoS ONE.* (2013) 8:e69034. doi: 10.1371/journal.pone.0069034
- Zheng PP, Hop WC, Luider TM, Sillevis Smitt PA, Kros EJM. Increased levels of circulating endothelial progenitor cells and circulating endothelial nitric oxide synthase in patients with gliomas. *Ann Neurol.* (2007) 62:40– 8. doi: 10.1002/ana.21151
- Noerholm M, Balaj L, Limperg T, Salehi A, Zhu LD, Hochberg FH, et al. Skog: RNA expression patterns in serum microvesicles from patients with glioblastoma multiforme and controls. *BMC Cancer*. (2012) 12:22. doi: 10.1186/1471-2407-12-22
- Arroyo JD, Chevillet JR, Kroh EM, Ruf IK, Pritchard CC, Gibson DF, et al. Argonaute2 complexes carry a population of circulating microRNAs independent of vesicles in human plasma. *Proc Natl Acad Sci USA*. (2011) 108:5003–8. doi: 10.1073/pnas.1019055108
- Turchinovich A, Weiz L, Langheinz A, Burwinkel B. Characterization of extracellular circulating microRNA. *Nucleic Acids Res.* (2011) 39:7223– 33. doi: 10.1093/nar/gkr254
- Manterola L, Guruceaga E, Gallego Perez-Larraya J, Gonzalez-Huarriz M, Jauregui P, Tejada S, et al. A small noncoding RNA signature found in exosomes of GBM patient serum as a diagnostic tool. *Neuro-oncology*. (2014) 16:520–7. doi: 10.1093/neuonc/not218
- 23. Peng Z, Liu C, Wu M. New insights into long noncoding RNAs and their roles in glioma. *Mol Cancer*. (2018) 17:61. doi: 10.1186/s12943-018-0812-2
- 24. Whiting PF, Rutjes AW, Westwood ME, Mallett S, Deeks JJ, Reitsma JB, et al. QUADAS-2: a revised tool for the quality

assessment of diagnostic accuracy studies. Ann Intern Med. (2011) 155:529-36. doi: 10.7326/0003-4819-155-8-201110180-00009

- Febbo PG, Ladanyi M, Aldape KD, De Marzo AM, Hammond ME, Hayes DF, et al. NCCN Task Force report: evaluating the clinical utility of tumor markers in oncology. J Natl Compr Canc Netw. 9(suppl.5):S1– 32. doi: 10.6004/jnccn.2011.0137
- Osti D, Del Bene M, Rappa G, Santos M, Matafora V, Richichi C, et al. Clinical significance of extracellular vesicles in plasma from glioblastoma patients. *Clin Cancer Res.* (2019) 25:266–76. doi: 10.1158/1078-0432.CCR-18-1941
- Sartori MT, Della Puppa A, Ballin A, Campello E, Radu CM, Saggiorato G, et al. Circulating microparticles of glial origin and tissue factor bearing in high-grade glioma: a potential prothrombotic role. *Thromb Haemost.* (2013) 110:378–85. doi: 10.1160/TH12-12-0957
- Galbo PM, Ciesielski MJ, Figel S, Maguire O, Qiu J, Wiltsie L, et al. Circulating CD9+/GFAP+/survivin+ exosomes in malignant glioma patients following survivin vaccination. *Oncotarget.* (2017) 8:114722–35. doi: 10.18632/oncotarget.21773
- Koch CJ, Lustig RA, Yang XY, Jenkins WT, Wolf RL, Martinez-Lage M, et al. Microvesicles as a biomarker for tumor progression versus treatment effect in radiation/temozolomide-treated glioblastoma patients. *Transl Oncol.* (2014) 7:752–8. doi: 10.1016/j.tranon.2014.10.004
- Shao H, Chung J, Balaj L, Charest A, Bigner DD, Carter BS, et al. Protein typing of circulating microvesicles allows real-time monitoring of glioblastoma therapy. *Nat Med.* (2012) 18:1835–40. doi: 10.1038/nm.2994
- Ilhan-Mutlu A, Wagner L, Wohrer A, Furtner J, Widhalm G, Marosi C, et al. Plasma microrna-21 concentration may be a useful biomarker in glioblastoma patients. *Cancer Invest.* (2012) 30:615–21. doi: 10.3109/07357907.2012.708071
- Lan F, Qing Q, Pan Q, Hu M, Yu H, Yue X. Serum exosomal miR-301a as a potential diagnostic and prognostic biomarker for human glioma. *Cell Oncol.* (2018) 41:25–33. doi: 10.1007/s13402-017-0355-3
- 33. Santangelo A, Imbruce P, Gardenghi B, Belli L, Agushi R, Tamanini A, et al. A microRNA signature from serum exosomes of patients with glioma as complementary diagnostic biomarker. J Neuro-Oncol. (2018) 136:51–62. doi: 10.1007/s11060-017-2639-x
- Shao H, Chung J, Lee K, Balaj L, Min C, Carter BS, et al. Chip-based analysis of exosomal mRNA mediating drug resistance in glioblastoma. *Nat Commun.* (2015) 6:6999. doi: 10.1038/ncomms7999
- 35. Siegal T, Charbit H, Paldor I, Zelikovitch B, Canello T, Benis A, et al. Dynamics of circulating hypoxia-mediated miRNAs and tumor response in patients with high-grade glioma treated with bevacizumab. *J Neurosurg.* (2016) 125:1008– 15. doi: 10.3171/2015.8.JNS15437
- 36. Swellam M, Ezz El Arab L, Al-Posttany AS, Said BS. Clinical impact of circulating oncogenic MiRNA-221 and MiRNA-222 in glioblastoma multiform. J Neurooncol. (2019) 144:545– 51. doi: 10.1007/s11060-019-03256-2
- Yang C, Wang C, Chen X, Chen S, Zhang Y, Zhi F, et al. Identification of seven serum microRNAs from a genome-wide serum microRNA expression profile as potential noninvasive biomarkers for malignant astrocytomas. *Int J Cancer.* (2013) 132:116–27. doi: 10.1002/ijc.27657
- Yue X, Lan F, Hu M, Pan Q, Wang Q, Wang J. Downregulation of serum microRNA-205 as a potential diagnostic and prognostic biomarker for human glioma. J Neurosurg. (2016) 124:122–8. doi: 10.3171/2015.1.JNS141577
- Faiq N, Lee M, Banks K, Lanman R, Pingle S, Kesari S, et al. Characterization of cell-free circulating tumor DNA in low grade and malignant gliomas. *Neuro-Oncology*. (2015) 17(suppl.5):v71–2. doi: 10.1093/neuonc/nov211.13
- 40. Faria G, Silva E, da Fonseca C, Quirico-Santos T. Circulating cellfree DNA as a prognostic and molecular marker for patients with brain tumors under perillyl alcohol-based therapy. *Int J Mol Sci.* (2018) 19:1610. doi: 10.3390/ijms19061610
- Noroxe DS, Ostrup O, Yde CW, Ahlborn LB, Nielsen FC, Michaelsen SR, et al. Cell-free DNA in newly diagnosed patients with glioblastoma—a clinical prospective feasibility study. *Oncotarget.* (2019) 10:4397–406. doi: 10.18632/oncotarget.27030
- Cordova C, Syeda MM, Corless B, Wiggins JM, Patel A, Kurz SC, et al. Plasma cell-free circulating tumor DNA (ctDNA) detection in longitudinally followed glioblastoma patients using TERT promoter mutation-specific droplet digital PCR assays. J Clin Oncol. (2019) 37:2026. doi: 10.1200/JCO.2019.37.15\_suppl.2026

- Gao F, Cui Y, Jiang H, Sui D, Wang Y, Jiang Z, et al. Circulating tumor cell is a common property of brain glioma and promotes the monitoring system. *Oncotarget.* (2016) 7:71330–340. doi: 10.18632/oncotarget. 11114
- MacArthur KM, Kao GD, Chandrasekaran S, Alonso-Basanta M, Chapman C, Lustig RA, et al. Detection of brain tumor cells in the peripheral blood by a telomerase promoter-based assay. *Cancer Res.* (2014) 74:2152– 9. doi: 10.1158/0008-5472.CAN-13-0813
- Stragliotto G, Souchelnytskyi N, Soderberg-Naucler C, Souchelnytskyi S. Case study of circulating tumor cells for monitoring of glioblastoma multiforme patients. *Neuro-Oncology*. (2016) 18(suppl.4):iv59. doi: 10.1093/neuonc/now188.207
- Sullivan JP, Nahed BV, Madden MW, Oliveira SM, Springer S, Bhere D, et al. Brain tumor cells in circulation are enriched for mesenchymal gene expression. *Cancer Discov.* (2014) 4:1299– 309. doi: 10.1158/2159-8290.CD-14-0471
- Iwamoto FM, Hottinger AF, Karimi S, Riedel E, Dantis J, Jahdi M, et al. Longitudinal prospective study of matrix metalloproteinase-9 as a serum marker in gliomas. J Neuro-Oncol. (2011) 105:607– 12. doi: 10.1007/s11060-011-0628-z
- Kesari S, Schiff D, Henson JW, Muzikansky A, Gigas DC, Doherty L, et al. Phase II study of temozolomide, thalidomide, and celecoxib for newly diagnosed glioblastoma in adults. *Neuro Oncol.* (2008) 10:300– 8. doi: 10.1215/15228517-2008-005
- Lin Y, Zhou K, Xu L, Chen B, Li G, Qiu X, et al. Plasma IGFBP-2 levels predict clinical outcomes of patients with high-grade gliomas. *Neuro-Oncology*. (2009) 11:468–76. doi: 10.1215/15228517-2008-114
- Lin Y, Wang JF, Gao GZ, Zhang GZ, Wang FL, Wang YJ. Plasma levels of tissue inhibitor of matrix metalloproteinase-1 correlate with diagnosis and prognosis of glioma patients. *Chin Med J.* (2013) 126:4295–300. doi: 10.3760/cma.j.issn.0366-6999.20131765
- 51. Pellegatta S, Eoli M, Frigerio S, Antozzi C, Bruzzone MG, Cantini G, et al. The natural killer cell response and tumor debulking are associated with prolonged survival in recurrent glioblastoma patients receiving dendritic cells loaded with autologous tumor lysates. *OncoImmunology*. (2013) 2:e23401. doi: 10.4161/onci.23401
- 52. Batchelor TT, Duda DG, di Tomaso E, Ancukiewicz M, Plotkin SR, Gerstner E, et al. Phase II study of cediranib, an oral pan-vascular endothelial growth factor receptor tyrosine kinase inhibitor, in patients with recurrent glioblastoma. *J Clin Oncol.* (2010) 28:2817–23. doi: 10.1200/JCO.2009. 26.3988
- 53. de Groot JF, Piao Y, Tran H, Gilbert M, H-Wu K, Liu J, et al. Myeloid biomarkers associated with glioblastoma response to anti-VEGF therapy with aflibercept. *Clin Cancer Res.* (2011) 17:4872–81. doi: 10.1158/1078-0432.CCR-11-0271
- Labussière M, Cheneau C, Prahst C, Gállego Pérez-Larraya J, Farina P, Lombardi G, et al. angiopoietin-2 may be involved in the resistance to bevacizumab in recurrent glioblastoma. *Cancer Invest.* (2016) 34:39– 44. doi: 10.3109/07357907.2015.1088948
- 55. Pace A, Mandoj C, Antenucci A, Villani V, Sperduti I, Casini B, et al. A predictive value of von Willebrand factor for early response to Bevacizumab therapy in recurrent glioma. J Neuro-Oncol. (2018) 138:527– 35. doi: 10.1007/s11060-018-2820-x
- Chinnaiyan P, Chowdhary S, Potthast L, Prabhu A, Tsai YY, Sarcar B, et al. Phase I trial of vorinostat combined with bevacizumab and CPT-11 in recurrent glioblastoma. *Neuro Oncol.* (2012) 14:93–100. doi: 10.1093/neuonc/nor187
- 57. Eoli M, Rabascio C, Cuppini L, Anghileri E, Pellegatta S, Calleri A, et al. Plasma levels of IL-8 and g-CSF in highgrade gliomas treated with bevacizumab. J Clin Oncol. (2012) 30:2083–3. doi: 10.1200/jco.2012.30.15\_suppl.2083
- Gomes AC, Caetano RO, Mello AN, Teixeira RM, Da Fonseca CO, Quiricio-Santos T. Intranasal administration of perillyl alcohol reduces serum levels of angiogenic inducers in patients with recurrent glioma. *Eur J Neurol.* (2011) 18(suppl.2):604. doi: 10.1111/j.1468-1331.2011.03552.x
- 59. Lee EQ, Kaley TJ, Duda DG, Schiff D, Lassman AB, Wong ET, et al. A multicenter, phase II, randomized, noncomparative clinical trial of radiation and temozolomide with or without vandetanib in

newly diagnosed glioblastoma patients. *Clin Cancer Res.* (2015) 21:3610–18. doi: 10.1158/1078-0432.CCR-14-3220

- Shehan J, Gupta S, Rachagani S, Zhang Y, Mallya K, Pai P, et al. Biomarkers for glioblastoma: MMP2 and NGAL. J Clin Oncol. (2016) 34(suppl.15):e13516. doi: 10.1200/JCO.2016.34.15\_suppl.e13516
- Tabouret E, Boudouresque F, Farina P, Barrié M, Bequet C, Sanson M, et al. MMP2 and MMP9 as candidate biomarkers to monitor bevacizumab therapy in high-grade glioma. *Neuro Oncol.* (2015) 17:1174– 6. doi: 10.1093/neuonc/nov094
- Cuppini L, Calleri A, Bruzzone MG, Prodi E, Anghileri E, Pellegatta S, et al. Prognostic value of CD109+ circulating endothelial cells in recurrent glioblastomas treated with bevacizumab and irinotecan. *PLoS ONE*. (2013) 8:e74345. doi: 10.1371/journal.pone.0074345
- Greenfield JP, Jin DK, Young LM, Christos PJ, Abrey L, Rafii S, et al. Surrogate markers predict angiogenic potential and survival in patients with glioblastoma multiforme. *Neurosurgery.* (2009) 64:819– 26. doi: 10.1227/01.NEU.0000343742.06625.DB
- Batchelor TT, Sorensen AG, di Tomaso E, Zhang WT, Duda Dan G, Cohen KS, et al. AZD2171, a pan-VEGF receptor tyrosine kinase inhibitor, normalizes tumor vasculature and alleviates edema in glioblastoma patients. *Cancer Cell.* (2007) 11:83–95. doi: 10.1016/j.ccr.2006.11.021
- Galanis E, Anderson SK, Lafky JM, Uhm JH, Giannini C, Kumar SK, et al. Phase II study of bevacizumab in combination with sorafenib in recurrent glioblastoma (N0776): a north central cancer treatment group trial. *Clin Cancer Res.* (2013) 19:4816–23. doi: 10.1158/1078-0432.CCR-13-0708
- Hassan B, Johnson KJ, Campian JL. Blood biomarker analysis to differentiate between pseudo-progression and true disease progression in post-treatment glioblastoma. J Clin Oncol. (2017) 35(15suppl.1):e13501. doi: 10.1200/JCO.2017.35.15\_suppl.e13501
- Huang Y, Ding H, Wu Q, Li Z, Li H, Li S, et al. Neutrophil-lymphocyte ratio dynamics are useful for distinguishing between recurrence and pseudoprogression in high-grade gliomas. *Cancer Manage Res.* (2019) 11:6003–9. doi: 10.2147/CMAR.S202546
- Parsa AT, Crane C, Yang I, Prados MD, Chang SM, Lanier L. Journal of neurooncology award a reliable blood biomarker that can be used to distinguish treatment effect from recurrent glioma. *J Neurosurg.* (2010) 113:A417. doi: 10.3171/jns.2010.113.2.1
- 69. Soler DC, Young AB, Cooper KD, Kerstetter-Fogle A, Barnholtz-Sloan JS, Gittleman H, et al. The ratio of HLA-DR and VNN2+ expression on CD14+ myeloid derived suppressor cells can distinguish glioblastoma from radiation necrosis patients. J Neuro-Oncol. (2017) 134:189–96. doi: 10.1007/s11060-017-2508-7
- Sturla L, Culhane JJ, Donahue J, Jeyapalan S. The role of natural killer (NK) cells in predicting pseudo-progression (PSDPG) vs true progression (TP) in high-grade gliomas. *Neuro-Oncology*. (2013) 15(suppl.3):iii130. doi: 10.1093/neuonc/not182
- Phuphanich S, Rudnick J, Chu R, Mazer M, Wang H, Serrano N, et al. A phase I trial of tumor-associated antigen-pulsed dendritic cell immunotherapy for patients with brain stem glioma and glioblastoma. *J Clin Oncol.* (2009) 27:2032. doi: 10.1200/jco.2009.27.15\_suppl.2032
- Hunn MK, Bauer E, Wood CE, Gasser O, Dzhelali M, Ancelet LR, et al. Dendritic cell vaccination combined with temozolomide retreatment: results of a phase I trial in patients with recurrent glioblastoma multiforme. *J Neuro-Oncology*. (2015) 121:319–29. doi: 10.1007/s11060-014-1635-7
- 73. Pellegatta S, Eoli M, Cuccarini V, Anghileri E, Pollo B, Pessina S, et al. Survival gain in glioblastoma patients treated with dendritic cell immunotherapy is associated with increased NK but not CD8(+) T cell activation in the presence of adjuvant temozolomide. *Oncoimmunology.* (2018) 7:e1412901. doi: 10.1080/2162402X.2017.1412901
- 74. Ruhle PF, Goerig N, Wunderlich R, Fietkau R, Gaipl US, Strnad A, et al. Modulations in the peripheral immune system of glioblastoma patient is connected to therapy and tumor progression-a case report from the IMMO-GLIO-01 trial. *Front Neurol.* (2017) 8:296. doi: 10.3389/fneur.2017.00296
- 75. Sakai K, Shimodaira S, Maejima S, Sano K, Higuchi Y, Koya T, et al. Clinical effect and immunological response in patients with advanced malignant glioma treated with WT1-pulsed dendritic cell-based immunotherapy: a report of two cases. *Interdiscipl Neurosurg.* (2017) 9:24– 9. doi: 10.1016/j.inat.2017.02.004

- Shah GD, Silver JS, Rosenfeld SS, Gavrilovic IT, Abrey LE, Lassman AB. Myelosuppression in patients benefiting from imatinib with hydroxyurea for recurrent malignant gliomas. J Neuro-Oncol. (2007) 85:217–22. doi: 10.1007/s11060-007-9408-1
- 77. Okada H, Kalinski P, Ueda R, Hoji A, Kohanbash G, Donegan TE, et al. Induction of CD8+ T-cell responses against novel glioma-associated antigen peptides and clinical activity by vaccinations with alpha-type 1 polarized dendritic cells and polyinosinic-polycytidylic acid stabilized by lysine and carboxymethylcellulose in patients with recurrent malignant glioma. *J Clin Oncol.* (2011) 29:330–6. doi: 10.1200/JCO.2010.30.7744
- Iwamoto FM, Hottinger AF, Karimi S, Riedel E, Dantis J, Jahdi M, et al. Serum YKL-40 is a marker of prognosis and disease status in high-grade gliomas. *Neuro Oncol.* (2011) 13:1244–51. doi: 10.1093/neuonc/nor117
- Wu H, Deng Z, Wang H, Li X, Sun T, Tao Z, et al. MGMT autoantibodies as a potential prediction of recurrence and treatment response biomarker for glioma patients. *Cancer Med.* (2019) 8:4359–69. doi: 10.1002/cam4.2346
- Yovino SG, Holdhoff M, Savage WJ, Dulloor P, Grossman SA, Everett A. Preliminary results of a biomarker discovery project for treatmentrelated brain injury (TRBI) in malignant glioma. J Clin Oncol. (2012) 30(30suppl.1):94. doi: 10.1200/jco.2012.30.30\_suppl.94
- Porter J, Hepner A, Pandey M, Prouet P, Hare F, Nasir SS, et al. Abstract 1352: serum neurofilament light (NfL), glial fibrillary acidic protein (GFAp) and tau protein are possible serum biomarkers for activity of brain metastases and gliomas. *Cancer Re.* (2019) 79(suppl.13):1352. doi: 10.1158/1538-7445.AM2019-1352
- Sampath P, Weaver CE, Sungarian A, Cortez S, Alderson L, Stopa EG. Cerebrospinal fluid (vascular endothelial growth factor) and serologic (recoverin) tumor markers for malignant glioma. *Cancer Control.* (2004) 11:174–80. doi: 10.1177/107327480401100305
- Vietheer JM, Rieger J, Wagner M, Senft C, Tichy J, Foerch C. Serum concentrations of glial fibrillary acidic protein (GFAP) do not indicate tumor recurrence in patients with glioblastoma. J Neurooncol. (2017) 135:193– 9. doi: 10.1007/s11060-017-2565-y
- Iwamoto FM, Hormigo A. Unveiling YKL-40, from serum marker to target therapy in glioblastoma. *Front Oncol.* (2014) 4:90. doi: 10.3389/fonc.2014.00090
- Zhang H, Ma L, Wang Q, Zheng X, Wu C, Xu BN. Role of magnetic resonance spectroscopy for the differentiation of recurrent glioma from radiation necrosis: a systematic review and meta-analysis. *Eur J Radiol.* (2014) 83:2181–9. doi: 10.1016/j.ejrad.2014.09.018
- Nihashi T, Dahabreh IJ, Terasawa T. Diagnostic accuracy of PET for recurrent glioma diagnosis: a meta-analysis. *AJNR Am J Neuroradiol.* (2013) 34:944– 50. doi: 10.3174/ajnr.A3324
- Chukwueke UN, Wen PY. Use of the Response Assessment in Neuro-Oncology (RANO) criteria in clinical trials and clinical practice. CNS Oncol. (2019) 8:CNS28. doi: 10.2217/cns-2018-0007
- Ma C, Nguyen HP T, Luwor RB, Stylli SS, Gogos A, Paradiso L, et al. A comprehensive meta-analysis of circulation miRNAs in glioma as potential diagnostic biomarker. *PLoS ONE*. (2018) 13:e0189452. doi: 10.1371/journal.pone.0189452
- Zhou Q, Liu J, Quan J, Liu W, Tan H, Li W. MicroRNAs as potential biomarkers for the diagnosis of glioma: a systematic review and meta-analysis. *Cancer Sci.* (2018) 109:2651–9. doi: 10.1111/cas.13714
- Liang RF, Li M, Yang Y, Wang X, Mao Q, Liu YH. Circulating miR-128 as a potential diagnostic biomarker for glioma. *Clin Neurol Neurosurg.* (2017) 160:88–91. doi: 10.1016/j.clineuro.2017.06.020
- Wang J, Che F, Zhang J. Cell-free microRNAs as non-invasive biomarkers in glioma: a diagnostic meta-analysis. *Int J Biol Markers*. (2019) 34:232– 42. doi: 10.1177/1724600819840033
- Diehl F, Schmidt K, Choti MA, Romans K, Goodman S, Li M, et al. Circulating mutant DNA to assess tumor dynamics. *Nat Med.* (2008) 14:985– 90. doi: 10.1038/nm.1789
- 93. Bettegowda C, Sausen M, Leary RJ, Kinde I, Wang Y, Agrawal N, et al. Detection of circulating tumor DNA in earlyand late-stage human malignancies. *Sci Transl Med.* (2014) 6:224ra24. doi: 10.1158/1538-7445.AM2014-5606
- 94. Underhill HR, Kitzman JO, Hellwig S, Welker NC, Daza R, Baker DN, et al. Fragment length of circulating tumor DNA. *PLoS Genet.* (2016) 12:e1006162. doi: 10.1371/journal.pgen.1006162

- Mouliere F, Chandrananda D, Piskorz AM, Moore EK, Morris J, Ahlborn LB, et al. Enhanced detection of circulating tumor DNA by fragment size analysis. *Sci Transl Med.* (2018) 10:eaat4921. doi: 10.1126/scitranslmed.aat 4921
- Seaman S, Stevens J, Yang MY, Logsdon D, Graff-Cherry C, St Croix B. Genes that distinguish physiological and pathological angiogenesis. *Cancer Cell.* (2007) 11:539–54. doi: 10.1016/j.ccr.2007.04.017
- Schünemann HJ, Oxman AD, Brozek J, Glasziou P, Jaeschke R, Vist GE, et al. Grading quality of evidence and strength of recommendations for diagnostic tests and strategies. *BMJ.* (2008) 336:1106–10. doi: 10.1136/bmj.39500.677199.AE

**Conflict of Interest:** The authors declare that the research was conducted in the absence of any commercial or financial relationships that could be construed as a potential conflict of interest.

Copyright © 2020 Raza, Tingate, Gkolia, Romero, Tee and Hunn. This is an openaccess article distributed under the terms of the Creative Commons Attribution License (CC BY). The use, distribution or reproduction in other forums is permitted, provided the original author(s) and the copyright owner(s) are credited and that the original publication in this journal is cited, in accordance with accepted academic practice. No use, distribution or reproduction is permitted which does not comply with these terms.