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Pyrosequencing versus methylation-specific PCR for assessment of MGMT methylation in tumor and blood samples of glioblastoma patients

Anna Estival¹, Carolina Sanz², Jose-Luis Ramirez¹, Jose Maria Velarde³, Marta Domenech¹, Cristina Carrato², Ramón de las Peñas⁴, Miguel Gil-Gil⁵, Juan Sepúlveda⁶, Roser Armengol⁷, Isaac Cardiel⁷, Alfonso Berrocal⁸, Raquel Luque⁹, Ana Herrero¹⁰ & Carmen Balana ¹

Circulating biomarkers in blood may provide an interesting alternative to risky tissue biopsies in the diagnosis and follow-up of glioblastoma patients. We have assessed *MGMT* methylation status in blood and tissue samples from unresected glioblastoma patients who had been included in the randomized GENOM-009 trial. Paired blood and tissue samples were assessed by methylation-specific PCR (MSP) and pyrosequencing (PYR). After establishing the minimum PYR cut-off that could yield a significant difference in overall survival, we assessed the sensitivity, specificity, positive predictive value and negative predictive value (NPV) of the analyses. Methylation could be detected in cfDNA by both MSP and PYR but with low concordance with results in tissue. Sensitivity was low for both methods (31% and 38%, respectively), while specificity was higher for MSP in blood than for PYR in plasma (96% vs 76%) and NPV was similar (56 vs 57%). Concordance of results in tissue by MSP and PYR was 84.3% (P < 0.001) and correlated with outcome. We conclude that detection of cfDNA in the blood of glioblastoma patients can be an alternative when tumor tissue is not available but methods for the detection of cfDNA in blood must improve before it can replace analysis in tumor tissue.

Glioblastoma accounts for the majority of gliomas (56.6%), with an incidence rate of 3.21 cases per 100,000. It is the malignant glial tumor with the worst outcome¹. Clinical prognostic factors are age, functional and cognitive status, and extent of surgery, where patients with only biopsy have the worst prognosis^{2,3}. The standard treatment, established in 2005 and not modified since, consists of maximal surgical excision followed by radiation therapy with concomitant and adjuvant temozolomide (TMZ)⁴. TMZ is a cytotoxic drug that acts as an alkylating agent. Methylation of the promoter of O⁶-methylguanine DNA methyltransferase (*MGMT*) impairs production of the DNA repair enzyme, which enhances the cytotoxic effect of TMZ. *MGMT* methylation is thus an important predictive and prognostic factor of TMZ treatment⁵, and patients with unmethylated (UNMET) *MGMT* seem to gain only a marginal benefit from adding TMZ to radiation therapy. The analysis of *MGMT* methylation is mandatory

¹Medical Oncology Service, Catalan Institute of Oncology Badalona, Hospital Germans Trias i Pujol, Applied Research Group in Oncology (B-ARGO Group), Badalona, Spain. ²Pathology Service, University Hospital Germans Trias i Pujol, Badalona, Spain. ³Statistical Unit, Applied Research Group in Oncology (B-ARGO Group), Institut Investigació Germans Trias i Pujol (IGTP), Badalona, Spain. ⁴Medical Oncology Service, Hospital Provincial de Castellón, Castellón, Spain. ⁵Medical Oncology Service, Catalan Institute of Oncology l'Hospitalet de LLobregat, Bellvitge Biomedical Research Institute (IDIBELL) l'Hospitalet de Llobregat, Barcelona, Spain. ⁶Medical Oncology Service, University Hospital 12 de Octubre, Madrid, Spain. ⁷Neurosurgery Service, Hospital Germans Trias i Pujol, Badalona, Spain. ⁸Medical Oncology Service, University Hospital General de Valencia, Valencia, Spain. ⁹Medical Oncology Service, University Hospital Virgen de las Nieves, Granada, Spain. ¹⁰Medical Oncology Service, Hospital Miguel Servet, Zaragoza, Spain. Correspondence and requests for materials should be addressed to C.B. (email: cbalana@ iconcologia.net) in clinical trials and is an important element in routine clinical practice when deciding between radiotherapy alone or combined with TMZ in elderly patients^{6–8}.

Other molecular alterations also drive the pathogenesis and behavior of glioblastoma and may affect clinical outcome and the sensitivity of tumors to therapy⁹⁻¹³. Intense research into these alterations has led to a new World Health Organization (WHO) central nervous system (CNS) tumor classification that incorporates several molecular diagnostic markers in addition to morphological criteria¹⁴. Furthermore, for a rapid integration of molecular pathogenesis into clinical practice, the Consortium to Inform Molecular and Practical Approaches to CNS Tumor Taxonomy (cIMPACT-NOW), established in 2016, regularly updates information on molecular criteria and clinical outcome¹⁵.

Over the last few years, there has been a growing interest in the analysis of tumor molecular alterations in body fluids, a practice known as "liquid biopsy"^{16–18}. In cell-free DNA (cfDNA), for example, investigators have detected point mutations, microsatellite alterations, chromosomal alterations, and hypermethylation of promoter sequences^{19–21}. Liquid biopsies are of special interest in brain tumors for several reasons. Firstly, due to the difficulty in obtaining tissue from tumors located in areas that are eloquent or not easily accessible, such as the brain stem, liquid biopsies are a highly promising diagnostic tool. Secondly, liquid biopsies are a non-invasive method to monitor molecular changes in tumors throughout the evolution of the disease^{20,22}. Finally, the problems involved in differentiating real tumor from treatment-related processes, such as radionecrosis, pseudoprogression, pseudoresponse and immune-related events with magnetic resonance imaging (MRI)^{23,24} suggest that liquid biopsies could be useful for monitoring treatment response and detecting recurrence. Molecular alterations in brain tumors have been detected in cerebrospinal fluid (CSF) and in blood (serum/plasma), includingalterations in DNA in exosomes and circulating tumor cells (CTCs), in cfDNA, and in microRNAs^{25,26}.

Our group has a long history of analyzing cfDNA in glioblastoma, through the assessment of *MGMT* methylation in blood using methylation-specific PCR (MSP)^{27,28}. However, we hypothesized that by using a more standardized and objective method, such as pyrosequencing, we could obtain more accurate results. Therefore, we used MSP and pyrosequencing (PYR) to analyze MGMT methylation both in tumor tissue and in paired blood samples from a homogeneous cohort of unresected glioblastoma patients and compared the results of the four analyses.

Results

Patients in the present study had been included in the randomized phase II trial GENOM009 (clinicaltrials. gov NCT01102595)²⁹. *MGMT* methylation status both in blood and tissue by MSP was a secondary objective in the trial. Of the 102 patients registered in the trial, nine withdrew before starting treatment and had no further follow-up, so they were not included in the outcome analyses. Ninety-three patients were randomized: 45 to receive TMZ and 48 to receive TMZ plus bevacizumab (BEV). Patient characteristics are summarized in Table 1.

We received 83 blood samples and 81 tissue samples from patients included in the GENOM 009 trial for the purpose of assessment of MGMT methylation by MSP. Of the 83 blood samples, six were too hemolyzed and three did not amplify correctly so we obtained results from 74 samples. After the analysis of MGMT methylation in blood (MSP-blood), 64 blood samples remained available for analysis by PYR. Of these 64 samples, 56 were able to be processed for PYR analysis in serum (PYR-serum) and 55 were able to be processed for PYR analysis by MSP-blood was informative for 74 patients, while analysis by PYR-serum was informative for 53 patients and by PYR-plasma for 49 patients. Of the 81 tumor samples, eight did not amplify correctly for analysis by MSP in tumor (MSP-tumor). After MSP-tumor, 78 tumor samples were available for analysis by PYR. Four of the eight samples that had not amplified correctly for MSP-tumor were rescued for analysis by PYR-tumor). Analysis of MGMT methylation by MSP-tumor was informative for analysis by PYR-tumor (PYR-tumor). Analysis of MGMT methylation by MSP-tumor was informative for analysis by PYR-tumor was informative for analysis by PYR-tumor, 50 had results for both MSP-tumor and PYR-plasma, and 39 had results for both PYR-tumor and PYR-plasma, and 39 had results for both PYR-tumor and PYR-serum (Fig. 1).

Correlation between MGMT methylation status by each of the analyses and patient outcome in terms of clinical benefit, progression-free survival (PFS), or overall survival (OS) was only calculated for patients who had been randomized in the trial and who had informative results for the analysis of MGMT methylation (Fig. 1).

Cut-off points for PYR-tumor, PYR-plasma, and PYR-serum. Table 2 depicts percentages of cytosine methylation in tumor tissue, plasma, serum, and normal tissue for each of the five CpG sites analyzed and for the mean of all five, as well as the optimal and minimum cut-off points to identify differences in OS. The optimal cut-off points were 11.4% for PYR-tumor and 3.4% for PYR-plasma. Since the cut-off for PYR-serum (1.6%) was not associated with a significant difference in OS, we ruled out PYR-serum values for further analyses. Minimum cut-offs were 5.0% for PYR-tumor and 3.4% for PYR-plasma. This minimum cut-off was used to classify patients as having MGMT methylation (MET) or not having MGMT methylation (UNMET) by PYR for further analyses.

Mean values of the five CpG sites in non-tumor tissue were 2.4% for colon samples, 3.6% for brain samples, and 2.8% for lymphocytes, indicating that some degree of methylation can be found in normal tissue, although all values were under the minimum cut-off identified for glioblastoma tissue (Table 2).

MGMT methylation by MSP-tumor and PYR-tumor. MSP-tumor identified 35 patients (47.9%) as MET and 38 (52.1%) as UNMET, while PYR-tumor identified 39 (52.7%) as MET and 35 (47.3%) as UNMET. Among the 70 patients with informative results for both MSP-tumor and PYR-tumor, eight (11.4%) identified as UNMET by MSP-tumor were identified as MET by PYR-tumor; conversely, three (4.3%) identified as MET by MSP-tumor were identified as UNMET by PYR-tumor (p < 0.001) (Table 3). Four cases classified as non-evaluable by MSP were evaluable by PYR. MSP-tumor had greater sensitivity (91% vs 78%) and NPV (90% vs 75%) to predict PYR-tumor results than did PYR-tumor to predict MSP-tumor (Table 4).

Characteristic	N=102 N (%)
Included in outcome analyses	
No	9 (8.82%)
Yes	93 (91.2%)
Treatment arm	
A: temozolomide	53 (52.0%)
B: temozolomide + bevacizumab	49 (48.0%)
Age, yrs	
median (range)	63 (36–79)
\geq 50 years old	97 (95.1%)
<50 years old	5 (4.90%)
Sex	
Male	60 (58.8%)
Female	42 (41.2%)
ECOG PS	
0-1	72 (71.3%)
>2	29 (28.7%)
MMSE score	
Unknown	9 (8.82%)
<27	37 (36.3%)
>=27	56 (54.9%)
Neurologic impairment	
Unknown	2 (1.96%)
No	40 (39.2%)
Yes	60 (58.8%)
Type of neurologic impairment	
None/Unknown	41 (40.2%)
Cognitive	5 (4.90%)
Convulsions	2 (1.96%)
Language	9 (8.82%)
More than one	18 (17.6%)
Motor symptoms	20 (19.6%)
Sensorial	4 (3.92%)
Visual	3 (2.94%)
Type of surgery	
Unknown	2 (1.96%)
Biopsy	83 (81.4%)
Partial resection	17 (16.7%)
Number of lesions	
1	78 (87.6%)
>1	11 (13.3%)
Tumor volume	
Median	141.8 cm ²
Range	16-528 cm ²

Table 1. Characteristics of patients registered in the GENOM009 trial (clinicaltrials.gov NCT01102595)²⁹.

 ECOG PS, Eastern Cooperative Oncology Group Performance Status; MMSE, Mini-Mental State Examination.

MGMT methylation by MSP-blood and PYR-plasma compared to MSP-tumor and PYR-tumor. MSP-blood identified 11 patients (14.9%) as MET and 63 (85.1%) as UNMET. PYR-plasma identified 14 (28.6%) as MET and 35 (71.4%) as UNMET. Of 50 patients with informative results in both MSP-tumor and MSP-blood, MSP-blood results were different from MSP-tumor results in 19 (38%) (p = 0.02) (Table 3). Of 33 patients with informative results in both PYR-tumor and PYR-plasma, results differed in 12 (36.3%) (p = 0.23). Sensitivity was low for both MSP-blood (31%) and PYR-plasma (38%), while specificity was higher for MSP-blood than for PYR-plasma (96% vs 76%) (Table 4).

MGMT methylation and prognosis. MGMT methylation by MSP-tumor correlated with clinical benefit (p = 0.01), PFS (p = 0.001), and OS (p = 0.001). MGMT methylation by PYR-tumor also correlated with outcomes (p = 0.006, p = 0.001, p = 0.005, respectively). MSP-blood results were not significantly associated with



Figure 1. CONSORT diagram showing patients and analyses in the study. (**A**) Numbers in shaded boxes indicate the patients included in the comparisons between the results of different analyses of MGMT methylation. (**B**) Numbers indicate patients evaluable for outcome in the GENOM 009 trial²⁹ and with informative results for the MGMT methylation analyses.

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outcome, while PYR-plasma results correlated with PFS (p = 0.002) and OS (p = 0.007) but not with clinical benefit (Table 5 and Figs 2 and 3).

Since four tumor samples did not amplify correctly for analysis by MSP but were able to be rescued for PYR, we speculated that PYR-tumor may yield more informative results than MSP-tumor. However, when we compared OS in the group of patients identified as MET by either method with those identified as UNMET by both methods, results were not superior to those obtained with either method alone (Table 5).

Discussion

MGMT methylation status is a well-known predictive and prognostic factor in glioblastoma, and its assessment at the time of diagnosis is an important factor both for clinical trials and for deciding on the optimal treatment strategy. In the present study, we have assessed *MGMT* methylation in tumor tissue and in blood by MSP and PYR and compared the reliability of the different analyses. Although results by MSP-tumor and PYR-tumor were not completely identical, concordance was high (84.3%; p < 0.001) and both methods provided reliable results. In contrast, assessment in blood was feasible but less reliable, with a high percentage of false negatives in both PYR-plasma and MSP-blood and a lower level of concordance with the results in tumor tissue.

Although several methods are currently available to assess MGMT methylation, there is as yet no agreement about which test should be considered the "gold standard"^{8,30}. Comparative studies often lack a previous study setting the optimal cut-off point for PYR related to clinical benefit^{31,32}. To further complicate the comparison of results, each method can interrogate different CpG sites in the MGMT promoter region, and there is still no consensus on how many CpG sites should be explored, which are most highly correlated with prognosis, and whether it is better to select them consecutively or randomly. In the PYR analyses in the present study, we explored CpG sites 74–78, which have a good correlation with the prognosis of patients newly diagnosed with glioblastoma^{30–34} and which overlap almost exactly with those interrogated by MSP^{30,35}.

In our clinical practice, we routinely use MSP to analyze MGMT methylation because it is a well-known technique, it is inexpensive when testing only a few samples, it has demonstrated sensitivity, and its results have been associated with outcome in clinical trials. However, MSP is a not an automatized method, making it difficult to standardize, and results may be influenced by tumor heterogeneity and/or a subjective interpretation. Conversely, PYR has been standardized and by giving a quantitative methylation percentage for each analyzed CpG, it is not subject to individual interpretation of results once the cut-off value has been defined. Different cut-off points have been recommended for PYR, with little consensus on the optimal point^{32,36,37}, which can vary according to the CpG sites analyzed and which will ultimately depend on its predictive capacity. Reported cut-off values range from 2.7% to 35% and the number of CpG sites analyzed range from four to 62³⁸. In the present study, we first defined the cut-off as the one that identified the maximal differences in OS in our patient population. In fact, however, differences in OS started to be seen at lower levels of methylation. Since the clinical objective behind determining MGMT methylation status is to identify those patients most likely to benefit from treatment with TMZ, we then identified the minimum cut-off that identified any differences in OS. This is in line with a recent pooled analysis of 4041 patients from four clinical trials, in whom MGMT methylation was analyzed by quantitative MSP. Lower MGMT methylation conferred some sensitivity to TMZ, leading the authors to recommend

	CpG 74		CpG 75		CpG 76		CpG 77		CpG 78		Mean of 5 CpG sites							
	PYR- tumor	PYR- plasma	PYR- serum	PYR- tumor	PYR- plasma	PYR- serum	PYR- tumor	PYR- plasma	PYR- serum	PYR- tumor	PYR- plasma	PYR- serum	PYR- tumor	PYR- plasma	PYR- serum	PYR- tumor	PYR- plasma	PYR- serum
Percentages in PYR-tumor (N=68), PYR-plasma (N=45), and PYR-serum (N=51)																		
Mean	18.86	7.27	6.19	19.82	8.49	7.23	18.88	9.33	7.19	19.69	8.10	6.57	13.95	8.86	7.60	18.2	8.4	6.9
Median	4.00	2.00	2.00	6.50	3.00	3.00	7.00	3.00	3.00	4.50	2.00	2.00	5.50	3.00	3.00	5.8	2.8	2.6
SD	24.707	18.012	12.972	23.701	18.721	12.702	23.053	19.153	13.166	25.829	19.856	14.459	20.522	20.042	13.688	21.610	19.0	13.3
Optimal cut-off ^a (p-value ^b)	6 (0.001)	3 (0.02)	1 (0.07)	6 (0.003)	4 (0.18)	2 (0.22)	10 (0.001)	8 (0.002)	2 (0.05)	15 (0.002)	3 (0.01)	1 (0.02)	8 (0.008)	6 (0.06)	1 (0.10)	11.4 (0.002)	3.4 (0.005)	1.6 (0.06)
Minimum cut-off ^a (p-value ^b)	_	_	_	_	_	_	_	_	_	_	_	_	_	_	_	5 (0.009)	3.4 (0.01)	NC ^d
Mean of 5 CpG Sites in Normal Tissue ^c																		
	Colon (N=10)		Brain (N	N=6) Lymphocytes (N=5)														
Mean	2.4 3.6			2.8														
Median	1.6		4.9		3.0													
SD	2.05 1.02			0.82														

Table 2. Percentage of cytosine methylation in five CpG sites in tumor, plasma, and serum samples by pyrosequencing (PYR). SD, standard deviation; NC, not calculated. ^aThe optimal cut-off was able to identify maximal differences in OS. The minimum cut-off was able to identify any significant differences in OS. ^bp-value for differences in overall survival. ^cAll values for normal tissue were below the minimum cut-off for PYR-tumor in glioblastoma tissue. ^dThe minimum cut-off for PYR-serum was not calculated because the cut-off was below the median value.

Results Compared				
MSP-tumor vs PYR-tumo N = 70 ^a	Concordance ^b	p ^c		
	MET by MSP-tumor N=34	UNMET by MSP-tumor N=36		
MET by PYR-tumor N = 39	31 (44.3%)	8 (11.4%)	84.3%	<0.001
UNMET by PYR-tumor N=31	3 (4.3%)	28 (40.0%)		
MSP-tumor vs MSP-bloo N=50 ^a	d			0.02
	MET by MSP-tumor N=26	UNMET by MSP-tumor N=24	62.0%	
MET by MSP-blood N=9	8 (16.0%)	1 (2.0%)	02.070	
UNMET by MSP-blood N=41	18 (36.0%)	23 (46.0%)		
PYR-tumor vs PYR-plass N=33 ^a	na			
	MET by PYR-tumor N=15	UNMET by PYR-tumor N=18	62 70/	0.22
MET by PYR-plasma N=7	5 (15.2%)	2 (6.1%)	03./%	0.25
UNMET by PYR-plasma N=26	10 (30.3%)	16 (48.5%)		

Table 3. Comparison of results of MGMT methylation analysis by MSP-tumor with MSP-blood, PYR-tumor, and PYR-plasma. ^aNumbers represent the total number of patients with informative results in both tests being compared. ^bPercentages indicate the number of cases with identical results in both tests being compared. ^c χ^2 or Fisher exact test.

that patients in the "gray zone" of MGMT methylation should be considered as methylated in terms of treatment selection³⁹.

Using the same criteria, we also determined the cut-off for PYR results in serum and in plasma. Unexpectedly, we found that PYR-serum values were not useful since it was impossible to set a cut-off to identify significant differences in OS. Serum seems to be an inadequate source of tumor derived cfDNA since it is often contaminated during clothing by normal nucleated cells⁴⁰, which also express some degree of MGMT methylation, as we and others^{41,42} have found. In fact, in the present study, we observed a slight degree of MGMT methylation in normal

Comparison	Parameter	Point Estimates (95% CI)
	Sensitivity	91% (76–98%)
M-MSP-tumor to predict PYR-tumor $N = 70$	Specificity	75% (58–88%)
p < 0.001	PPV	78% (62–89%)
	NPV	90% (73–98%)
	Sensitivity	78% (62–89%)
PYR-tumor to predict MSP-tumor	Specificity	90% (73–98%)
p < 0.001	PPV	91% (76–98%)
	NPV	75% (58–88%)
	Sensitivity	31% (14–52%)
MSP-blood to predict MSP-tumor	Specificity	96% (79–100%)
p = 0.02	PPV	89% (52–100%)
	NPV	56% (40-72%)
	Sensitivity	38% (15-65%)
PYR-plasma to predict PYR-tumor	Specificity	76% (50–93%)
p = 0.23	PPV	60% (26-88%)
	NPV	57% (34-77%)

Table 4. Sensitivity, specificity, positive predictive value, (PPV), and negative predictive value (NPV) of each test to predict MGMT methylation status as identified by the second test.

brain, lymphocyte, and colon tissue samples, although all values were under the minimum cut-off identified for glioblastoma tissue.

There was some discordance between MSP-tumor and PYR-tumor results. Eight cases identified as UNMET by MSP were identified as MET by PYR. This could be due to the fact that PYR can detect partial methylation of a given CpG that could be labelled UNMET by MSP³⁰. In addition, three cases identified as UNMET by PYR were classified as MET by MSP, perhaps due to an insufficient bisulfite conversion⁴³. Moreover, four cases deemed non-evaluable by MSP were evaluable by PYR, probably because less DNA is required to run PYR. These discordances led us to postulate that the two tests could complement each other, so we analyzed differences in OS between patients identified as MET by either test and those identified as UNMET by both tests. However, we found that results were similar to those obtained by each method alone. Therefore, we can conclude that both methods can be reliably used to identify patients as MET or UNMET and we recommend performing PYR after MSP only if MSP does not give an informative result and quality controls fail.

The shedding of cfDNA from tumors to fluids has been known for many years⁴⁴, and multiple studies have shown that tumor-associated alterations can be detected in different fluids at the protein, DNA, and RNA levels using diverse methods, making these liquid biopsies an easier and less invasive way to obtain information on the tumor. Brain tumors have not been an exception to the search for circulating biomarkers^{17,26,45}. In the present study, we were able to detect methylation in cfDNA by both MSP-blood and PYR-plasma, but when we examined the capacity of MSP-blood and PYR-plasma to predict MGMT methylation status by the matched tumor assessments, concordance was relatively low, with a sensitivity of 30–40%. The specificity and PPV of PYR-plasma was higher than that of MSP-blood, but false negatives occurred in around 56% of cases by both methods. MGMT methylation in cfDNA has been studied but data on sensitivity, specificity, PPV and NPV are seldom reported^{27,46,47}.

The low concordance between results obtained in tissue and plasma could be due to several factors. Firstly, glioblastoma tumors may not shed DNA into the circulation due to the special structure of the blood-brain barrier (BBB) and the blood-brain tumor barrier (BBTB)⁴⁸⁻⁵⁰. Even though cfDNA can be detected in the blood of glioblastoma patients⁵¹, the release of DNA to body fluids has been related to tumor size and aggressiveness²¹. All our patients had enhancing measurable disease on the MRI (Table 1) at the time of blood sample extraction and enrollment in the trial. As contrast enhancement lesions on MRI are due to disruption of the BBB, this suggests that these tumors would logically shed DNA, which would not be prevented by a disrupted BBB. Secondly, even though cfDNA is abundant in plasma, only 0.01-10% comes from tumors, while the rest is released from bone marrow (80–90%), or skin and the gastrointestinal tract (5–10%)²¹. Moreover, cfDNA in fluids is found as small fragments (180-200 bp) that may not contain the regions subjected to analyses of MGMT methylation. On the other hand, cfDNA can also be released to CSF and it seems logical that glioblastoma cfDNA would be more abundant in CSF, simply because CSF is in close contact with tumor cells in CNS tumors⁵² or because cfDNA could be released through areas without the BBB, such as the circumventricular organs and the choroid plexus^{53,54}. In fact, diverse mutations detected in CSF could potentially be used for the diagnosis and follow-up of glioma^{52,55-59}. Several studies have compared results in serum and CSF and found that sensitivity in CSF seems to be higher than in serum^{47,55}. However, increased intracranial pressure can be a limitation for the routine assessment of CSF in patients with intracranial hypertension because lumbar puncture carries the risk of cerebral herniation in these cases⁶⁰. Finally, the detection of cfDNA is also limited by the sensitivity of the technique, as semi-quantitative PCR detects only around 1% of cfDNA. Nevertheless, if more sensitive methods for detecting cfDNA in fluids are developed, these limitations could be minimized in the near future⁶¹.

	MSP-tumor					
	MET	UNMET	р			
Clinical benefit $(N = 63)^a$			0.01			
Yes	19 (65.5)	10 (34.5)				
No	11 (32.4)	23 (67.6)				
PFS $(N = 67)^{a}$			0.001			
months (95% CI)	6.2 (2.3-10.0)	2.2 (1.9–2.5)				
OS $(N = 66)^{a}$			0.001			
months (95% CI)	12.1 (7.7–16.5)	4.9 (2.9-6.8)				
	MSP-blood					
	MET	UNMET	р			
Clinical benefit (N = 67) ^a			0.17			
Yes	7 (21.9)	25 (78.1)				
No	3 (8.6)	32 (91.4)				
PFS $(N = 70)^{a}$			0.71			
months (95% CI)	4.8 (3.3-6.2)	2.8 (0.3-5.2)				
OS (N=71) ^a			0.92			
months (95% CI)	8.8 (3.9–13.6)	9.0 (6.1–11.9)				
	PYR-tumor					
	MET	UNMET	р			
Clinical benefit (N=65) ^a			0.006			
Yes	21 (72.4)	8 (27.6)				
No	8 (27.6)	23 (63.9)				
PFS (N = 68) ^a			0.001			
months (95% CI)	4.8 (1.8-7.9)	2.2 (1.9–2.5)				
OS $(N = 67)^{a}$			0.005			
months (95% CI)	9.6 (7.0-12.1)	4.9 (2.3-7.4)				
	PYR-plasma					
	MET	UNMET	р			
Clinical benefit (N=43) ^a			0.31			
Yes	7 (33.3)	14 (66.7)				
No	4 (18.2)	18 (81.8)				
PFS (N = 45) ^a			0.002			
months (95% CI)	9 (1.7–16.2)	2.8 (1.4-4.1)				
OS (N=45) ^a			0.007			
months (95% CI)	13.4 (0-41.3)	8.0 (5.5-10.4)				
	PYR-tumor + MSP-tumor					
	MET by either test	UNMET by both tests				
PFS (N=64) ^a			0.01			
months (95% CI)	4.6 (2.7-6.6)	2.3 (1.8-2.6)				
OS (N=63) ^a			0.004			
months (95% CI)	96(62-129)	15(25.65)				

Table 5. Clinical benefit, progression-free survival (PFS), and overall survival (OS) according to MGMT methylation status by MSP-tumor, MSP-blood, PYR-tumor, PYR-plasma, and MSP-tumor plus PYR-tumor. ^aClinical benefit, PFS, and OS were analyzed only for patients with informative results in the MGMT methylation analysis. Clinical benefit was analyzed only in patients evaluable for response in the clinical trial. PFS and OS were analyzed for patients included in the trial.

In summary, both PYR and MSP are reliable methods for detecting MGMT methylation in tumor tissue and can be useful for identifying patients likely to benefit from TMZ. MSP can be recommended for use with small numbers of patients, while PYR is more efficient in large numbers of cases and, moreover, can serve as a useful back-up when MSP results are inconclusive^{32,62}. In contrast, both methods are imperfect for analysis in blood.

The main limitation of our study is the low number of paired tissue-blood samples that could be compared. Nevertheless, we are convinced that the identification of reliable circulating biomarkers can lead to major changes in our approach to brain tumors, making it essential to continue to search for circulating biomarkers with high sensitivity, specificity, PPV, and NPV. We therefore recommend that biomarker analysis be incorporated into large clinical trials.





Methods

Patients and samples. Patients proceeded from the GENOM 009 trial²⁹, in which unresected glioblastoma patients were randomized to add or not bevacizumab to two cycles of TMZ before radiation therapy with concomitant and adjuvant TMZ. Overall response rate, PFS and OS were primary endpoints of the trial. Results showed a non-significant trend towards improvement in PFS and OS for those patients treated with bevacizumab. A secondary endpoint was the study of MGMT methylation status in blood as compared with tissue in these patients. Before patient inclusion, formalin-fixed paraffin-embedded (FFPE) tumor tissue blocks and paired blood samples were obtained from patients and sent to our center for assessing the methylation status of *MGMT*.

In addition, we obtained 21 samples of non-tumor tissue proceeding from normal brain (6), lymphocytes (5), and colon (10). MGMT methylation status in these samples was analyzed by PYR.

Written informed consent was obtained from all patients before registration, both for participation in the trial and for molecular tests. The study was approved by the Ethics Committee of the Hospital Germans Trias i Pujol, Badalona, Spain and by the Ethics Committees of each of the participating hospitals. All research was performed in accordance with relevant guidelines/regulations.

DNA extraction from tissue and serum/plasma samples. Genomic DNA was extracted from FFPE tissue after macrodissection was performed to assure more than 80% of tumor cells. The material was deparafinated and DNA obtained using the QIAamp[®] DNA micro kit (Qiagen, Hilden, Germany). Venous blood (10 mL) was drawn from each patient into Vacutainer tubes containing SST (serum-separating tube) gel and clot activator (Becton Dickinson, NJ, USA), and for plasma in Vacutainer tubes containing k2E (EDTA). Serum and plasma were isolated after centrifugation at 2,500 rpm for 10 min at room temperature and were stored at -20 °C until analysis. The QIAmp[®] Blood Mini-Kit (Qiagen) was used to obtain DNA according to the manufacturer's instructions.

DNA bisulfite conversion. DNA methylation in CpG island of *MGMT* (Genbank accession number NG_052673.1) was determined using two different methods, MSP and PYR. The first step in both methods was





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DNA bisulfite conversion. The bisulfite treatment converts unmethylated – but not methylated – cytosines, to uracil. Briefly, a total of 250 ng of genomic DNA was modified using EZ DNA Methylation-Gold TM kit (Zymo Research, Ecogen, Madrid), following the manufacturer's instructions, and recovered in a final volume of $20 \,\mu$ l.

MGMT methylation assessment by MSP. Bisulfite-converted DNA (2 μ l) was amplified using specific primers (previously described for CpG sites 74–78⁶³) for methylated and unmethylated DNA independently, using HotStart[®]Plus DNA polymerase (Qiagen, Izasa, Spain) and following the manufacturer's instructions. Cycling conditions were 5 min 95 °C, followed by 42 cycles of (30'' 95 °C, 30'' 59 °C, 30'' 72 °C) and 5 min at 72 °C. PCR reactions (15 μ l) were analyzed on a 2% agarose gel stained with ethidium bromide or Syber Safe. Commercial methylated DNA and unmethylated DNA (Zymo Research, Ecogen, Spain) served as positive controls for methylated and unmethylated PCR reactions.

A sample was considered methylated when a band was observed in PCR (in duplicate) with methylated primers. When no band was observed in either tube the sample was assessed as "not evaluable". When both duplicates gave different results, the test was repeated for that sample in triplicate.

MGMT methylation assessment by PYR. Bisulfite-converted DNA (2 μ l) was used to amplify the MGMT promoter with the primers provided by the Pyromark[®]Q24 CpG MGMT kit. A PCR was set up with the reactives and conditions given by the PyroMark[®]PCR kit. The same CpG sites (74 to 78) analyzed by MSP were analyzed by PYR. Briefly, PCR conditions for tissue DNA were 5 min 95 °C, followed by 45 cycles of (20″ 95 °C, 30″ 53 °C, 20″ 72 °C) and 5 min at 72 °C. In plasma and serum, the number of cycles was increased to 50. PCR products (10 μ l) were attached to Streptavidina Sepharose perls (GE Healthcare, Buckinghamshire, UK) and the template strands were purified in the Pyromark Q24 Vaccum Workstation. The purified templates were incubated for 20 min with the sequencing primer provided by the kit and run in the instrument Qiagen Pyromark Q24 System with the reactives of Pyromark Gold Q24 Reagents. All the steps were followed according to the Pyromark Q24 user manual. Sequencing conditions and analysis of results were performed with the Pyromark Q24 sofware 2.0.8. Commercial unmethylated DNA was used to calculate baseline (n = 13).

In case of discordant results between PYR and MSP, MSP was repeated to confirm the discordance.

Determination of cut-off points for PYR-tumor, PYR-plasma, and PYR-serum results. PYR results were delivered as a percentage of cytosine methylation for each CpG site assessed in tissue, plasma, and serum. We created a new variable using the overall mean of all five CpG sites (Table 2). We calculated the cut-off that yielded maximal differences in OS for each CpG and for the mean (optimal cut-off point) for PYR-tumor, PYR-plasma, and PYR-serum. However, despite having identified the optimal cut-off point for maximal differences in OS, we reasoned that many patients with MGMT methylation status below that cut-off could still benefit from treatment because of a certain degree of methylation. We therefore identified the minimum cut-off point for the mean of all five CpG sites that yielded a significant difference in OS. This cut-off was used for further analyses. If the value was higher than the cut-off, a sample was classified as MET; if it was equal to or lower than the cut-off, a sample was classified as UNMET. All cut-off points were calculated with the Maximally Selected Rank Statistics (Maxstat package of R, version 1.1.442) and confirmed with the Kaplan-Meier method and log-rank test.

Statistical analyses. The epiR package of R was used to calculate the sensitivity, specificity, PPV, and NPV of the different analyses to predict MGMT methylation status as assessed by other analyses. Since in this case, none of the analyses could be considered the established gold standard against which to compare the others, we performed bilateral comparisons of PYR-tumor vs MSP-tumor, MSP-tumor vs PYR-tumor, PYR-plasma vs PYR-tumor, and MSP-blood vs MSP-tumor.

Categorical variables were compared with the χ^2 test or the Fisher's exact test. All patients who started treatment were included in the analyses. Response to neoadjuvant therapy was evaluated by RANO criteria, after two cycles of therapy and before radiation therapy. For the purpose of analysis, responses were grouped as clinical benefit (stable disease, partial response, or complete response) and no clinical benefit (progression)⁶⁴. PFS was defined as the time from inclusion to the first documented progression or death from any cause, while OS was defined as the time from inclusion to death from any cause. Patients who were still progression-free or alive at the date of last contact were censored. Median PFS and OS were calculated with the Kaplan-Meier method and compared using the log-rank test. All statistical tests were two-sided and significance was set at 0.05. These analyses were performed with SPSS v24.0 (IBM).

Data Availability

The datasets generated during and/or analyzed during the current study are available from the corresponding author on reasonable request.

References

- 1. Ostrom, Q. T. *et al.* CBTRUS Statistical Report: Primary Brain and Other Central Nervous System Tumors Diagnosed in the United States in 2011–2015. *Neuro-Oncology* **20**, iv1–iv86 (2018).
- 2. Curran, W. J. Jr. *et al.* Recursive partitioning analysis of prognostic factors in three Radiation Therapy Oncology Group malignant glioma trials. *J Natl Cancer Inst* **85**, 704–710 (1993).
- 3. Mirimanoff, R. O. *et al.* Radiotherapy and temozolomide for newly diagnosed glioblastoma: recursive partitioning analysis of the EORTC 26981/22981-NCIC CE3 phase III randomized trial. *J Clin Oncol* 24, 2563–2569 (2006).
- 4. Stupp, R. et al. Radiotherapy plus concomitant and adjuvant temozolomide for glioblastoma. N Engl J Med 352, 987-996 (2005).
- 5. Hegi, M. E. et al. MGMT gene silencing and benefit from temozolomide in glioblastoma. N Engl J Med 352, 997–1003 (2005).
- Malmstrom, A. *et al.* Temozolomide versus standard 6-week radiotherapy versus hypofractionated radiotherapy in patients older than 60 years with glioblastoma: the Nordic randomised, phase 3 trial. *Lancet Oncol* 13, 916–926 (2012).
- 7. Wick, W. et al. Temozolomide chemotherapy alone versus radiotherapy alone for malignant astrocytoma in the elderly: the NOA-08 randomised, phase 3 trial. Lancet Oncol 13, 707–715 (2012).
- 8. Weller, M. *et al.* MGMT promoter methylation in malignant gliomas: ready for personalized medicine? *Nat Rev Neurol* **6**, 39–51 (2010).
- The Cancer Genome Atlas Research, N. et al. Comprehensive genomic characterization defines human glioblastoma genes and core pathways. Nature 455, 1061 (2008).
- Verhaak, R. G. et al. Integrated genomic analysis identifies clinically relevant subtypes of glioblastoma characterized by abnormalities in PDGFRA, IDH1, EGFR, and NF1. Cancer Cell 17, 98–110 (2010).
- 11. Brennan, C. W. et al. The somatic genomic landscape of glioblastoma. Cell 155, 462-477 (2013).
- Noushmehr, H. et al. Identification of a CpG island methylator phenotype that defines a distinct subgroup of glioma. Cancer Cell 17, 510–522 (2010).
- Wang, Q. et al. Tumor Evolution of Glioma-Intrinsic Gene Expression Subtypes Associates with Immunological Changes in the Microenvironment. Cancer Cell 32, 42–56 e46 (2017).
- Louis, D. N. et al. The 2016 World Health Organization Classification of Tumors of the Central Nervous System: a summary. Acta Neuropathol 131, 803–820 (2016).
- Brat, D. J. et al. cIMPACT-NOW update 3: recommended diagnostic criteria for "Diffuse astrocytic glioma, IDH-wildtype, with molecular features of glioblastoma, WHO grade IV". Acta neuropathologica 136, 805–810 (2018).
- 16. Figueroa, J. M. & Carter, B. S. Detection of glioblastoma in biofluids. J Neurosurg 129, 334-340 (2018).
- 17. Kros, J. M. et al. Circulating glioma biomarkers. Neuro Oncol 17, 343-360 (2015).
- Siravegna, G., Marsoni, S., Siena, S. & Bardelli, A. Integrating liquid biopsies into the management of cancer. Nature Reviews Clinical Oncology 14, 531 (2017).
- 19. Fleischhacker, M. & Schmidt, B. Circulating nucleic acids (CNAs) and cancer-a survey. Biochim Biophys Acta 1775, 181-232 (2007).
- 20. McDermott, U., Downing, J. R. & Stratton, M. R. Genomics and the continuum of cancer care. *N Engl J Med* **364**, 340–350 (2011).
- 21. Bettegowda, C. *et al.* Detection of circulating tumor DNA in early- and late-stage human malignancies. *Sci Transl Med* **6**, 224ra224 (2014).
- Felsberg, J. et al. Epidermal Growth Factor Receptor Variant III (EGFRvIII) Positivity in EGFR-Amplified Glioblastomas: Prognostic Role and Comparison between Primary and Recurrent Tumors. Clin Cancer Res 23, 6846–6855 (2017).
- Huang, R. Y., Neagu, M. R., Reardon, D. A. & Wen, P. Y. Pitfalls in the neuroimaging of glioblastoma in the era of antiangiogenic and immuno/targeted therapy - detecting illusive disease, defining response. *Front Neurol* 6, 33 (2015).
- 24. Brandsma, D. & van den Bent, M. J. Pseudoprogression and pseudoresponse in the treatment of gliomas. *Current opinion in neurology* 22, 633-638 (2009).
- Shankar, G. M., Balaj, L., Stott, S. L., Nahed, B. & Carter, B. S. Liquid biopsy for brain tumors. *Expert Rev Mol Diagn* 17, 943–947 (2017).

- Zachariah, M. A., Oliveira-Costa, J. P., Carter, B. S., Stott, S. L. & Nahed, B. V. Blood-based biomarkers for the diagnosis and monitoring of gliomas. *Neuro Oncol* 20, 1155–1161 (2018).
- Balana, C. et al. O6-methyl-guanine-DNA methyltransferase methylation in serum and tumor DNA predicts response to 1,3-bis(2chloroethyl)-1-nitrosourea but not to temozolamide plus cisplatin in glioblastoma multiforme. Clin Cancer Res 9, 1461–1468 (2003).
- 28. Ramirez, J. L. et al. Serum DNA as a tool for cancer patient management. Roczniki Akademii Medycznej w Białymstoku 48, 34–41 (2003).
- Balana, C. *et al.* Bevacizumab and temozolomide versus temozolomide alone as neoadjuvant treatment in unresected glioblastoma: the GENOM 009 randomized phase II trial. *J Neurooncol* 127, 569–579 (2016).
- 30. Christians, A. *et al.* Prognostic value of three different methods of MGMT promoter methylation analysis in a prospective trial on newly diagnosed glioblastoma. *PLoS One* 7, e33449 (2012).
- Karayan-Tapon, L. et al. Prognostic value of O6-methylguanine-DNA methyltransferase status in glioblastoma patients, assessed by five different methods. J Neurooncol 97, 311–322 (2010).
- 32. Quillien, V. et al. Comparative assessment of 5 methods (methylation-specific polymerase chain reaction, MethyLight, pyrosequencing, methylation-sensitive high-resolution melting, and immunohistochemistry) to analyze O6-methylguanine-DNA-methyltranferase in a series of 100 glioblastoma patients. Cancer 118, 4201–4211 (2012).
- Havik, A. B. et al. MGMT promoter methylation in gliomas-assessment by pyrosequencing and quantitative methylation-specific PCR. J Transl Med 10, 36 (2012).
- 34. Reifenberger, G. *et al.* Predictive impact of MGMT promoter methylation in glioblastoma of the elderly. *Int J Cancer* **131**, 1342–1350 (2012).
- Chai, R. C. et al. A novel analytical model of MGMT methylation pyrosequencing offers improved predictive performance in patients with gliomas. Mod Pathol (2018).
- 36. Lattanzio, L. *et al.* MGMT promoter methylation and glioblastoma: a comparison of analytical methods and of tumor specimens. *Int J Biol Markers* **30**, e208–216 (2015).
- Johannessen, L. E. et al. MGMT Gene Promoter Methylation Status Assessment of Two Pyrosequencing Kits and Three Methylation-specific PCR Methods for their Predictive Capacity in Glioblastomas. Cancer Genomics Proteomics 15, 437–446 (2018).
- Bienkowski, M. et al. Clinical Neuropathology practice guide 5-2015: MGMT methylation pyrosequencing in glioblastoma: unresolved issues and open questions. Clin Neuropathol 34, 250–257 (2015).
- Hegi, M. E. et al. MGMT Promoter Methylation Cutoff with Safety Margin for Selecting Glioblastoma Patients into Trials Omitting Temozolomide. A Pooled Analysis of Four Clinical Trials. Clin Cancer Res (2018).
- 40. Vallee, A. *et al.* Detection of EGFR gene mutations in non-small cell lung cancer: lessons from a single-institution routine analysis of 1,403 tumor samples. *Int J Oncol* **43**, 1045–1051 (2013).
- Ghosh, S. et al. Tissue specific DNA methylation of CpG islands in normal human adult somatic tissues distinguishes neural from non-neural tissues. Epigenetics 5, 527–538 (2010).
- 42. Weber, M. *et al.* Chromosome-wide and promoter-specific analyses identify sites of differential DNA methylation in normal and transformed human cells. *Nat Genet* **37**, 853–862 (2005).
- Do, H. & Dobrovic, A. Sequence artifacts in DNA from formalin-fixed tissues: causes and strategies for minimization. Clin Chem 61, 64–71 (2015).
- Leon, S. A., Shapiro, B., Sklaroff, D. M. & Yaros, M. J. Free DNA in the serum of cancer patients and the effect of therapy. *Cancer Res* 37, 646–650 (1977).
- Fontanilles, M., Duran-Pena, A. & Idbaih, A. Liquid Biopsy in Primary Brain Tumors: Looking for Stardust! Curr Neurol Neurosci Rep 18, 13 (2018).
- Lavon, I., Refael, M., Zelikovitch, B., Shalom, E. & Siegal, T. Serum DNA can define tumor-specific genetic and epigenetic markers in gliomas of various grades. *Neuro Oncol* 12, 173–180 (2010).
- 47. Wang, Z. *et al.* MGMT promoter methylation in serum and cerebrospinal fluid as a tumor-specific biomarker of glioma. *Biomed Rep* 3, 543–548 (2015).
- van Tellingen, O. *et al.* Overcoming the blood-brain tumor barrier for effective glioblastoma treatment. Drug Resist Updat 19, 1–12 (2015).
- 49. Nag, S. Morphology and molecular properties of cellular components of normal cerebral vessels. Methods Mol Med 89, 3-36 (2003).
- 50. Hynynen, K. Ultrasound for drug and gene delivery to the brain. Adv Drug Deliv Rev 60, 1209-1217 (2008).
- Balana, C. *et al.* O-6-methyl-guanine-DNA methyltransferase methylation in serum and tumor DNA predicts response to 1,3-bis(2chloroethyl)-1-nitrosourea but not to temozolamide plus cisplatin in glioblastoma multiforme. *Clinical Cancer Research* 9, 1461–1468 (2003).
- 52. De Mattos-Arruda, L. *et al.* Cerebrospinal fluid-derived circulating tumour DNA better represents the genomic alterations of brain tumours than plasma. *Nature communications* **6**, 8839 (2015).
- 53. Miyata, S. New aspects in fenestrated capillary and tissue dynamics in the sensory circumventricular organs of adult brains. *Front Neurosci* 9, 390 (2015).
- Rodriguez, E. M., Blazquez, J. L. & Guerra, M. The design of barriers in the hypothalamus allows the median eminence and the arcuate nucleus to enjoy private milieus: the former opens to the portal blood and the latter to the cerebrospinal fluid. *Peptides* 31, 757–776 (2010).
- Martinez-Ricarte, F. et al. Molecular Diagnosis of Diffuse Gliomas through Sequencing of Cell-Free Circulating Tumor DNA from Cerebrospinal Fluid. Clin Cancer Res 24, 2812–2819 (2018).
- 56. Huang, T. Y. et al. Detection of Histone H3 mutations in cerebrospinal fluid-derived tumor DNA from children with diffuse midline glioma. Acta Neuropathol Commun 5, 28 (2017).
- 57. Mouliere, F. et al. Detection of cell-free DNA fragmentation and copy number alterations in cerebrospinal fluid from glioma patients. EMBO Mol Med (2018).
- Pan, W., Gu, W., Nagpal, S., Gephart, M. H. & Quake, S. R. Brain tumor mutations detected in cerebral spinal fluid. *Clin Chem* 61, 514–522 (2015).
- 59. Shi, W. *et al.* Prognostic value of free DNA quantification in serum and cerebrospinal fluid in glioma patients. *J Mol Neurosci* 46, 470–475 (2012).
- 60. Jacques, G. & Cormac, O. Central nervous system tumors. Handb Clin Neurol 112, 931-958 (2013).
- 61. Olmedillas-Lopez, S., Garcia-Arranz, M. & Garcia-Olmo, D. Current and Emerging Applications of Droplet Digital PCR in Oncology. *Mol Diagn Ther* **21**, 493–510 (2017).
- 62. Mansouri, A. *et al.* MGMT promoter methylation status testing to guide therapy for glioblastoma: refining the approach based on emerging evidence and current challenges. *Neuro Oncol* (2018).
- Esteller, M., Hamilton, S. R., Burger, P. C., Baylin, S. B. & Herman, J. G. Inactivation of the DNA repair gene O6-methylguanine-DNA methyltransferase by promoter hypermethylation is a common event in primary human neoplasia. *Cancer Res* 59, 793–797 (1999).
- 64. Wen, P. Y. *et al.* Updated response assessment criteria for high-grade gliomas: response assessment in neuro-oncology working group. *J Clin Oncol* 28, 1963–1972 (2010).

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Author Contributions

All authors contributed to the work as follows: C.B., A.E., C.S. and J.L.R. designed the work. J.M.V., C.B. did the statistical analyses and prepared tables and figures. A.E., C.S. and J.L.R. performed the analyses of M.G.M.T. in tissue, blood, serum, plasma and interpreted M.G.M.T. data. C.B., A.E., C.S., J.L.R. interpreted M.G.M.T. and clinical data. A.E., M.D., C.C., R.d.L.P., M.G.-G., J.S., R.A., I.C., A.B., R.L., A.H. and C.B. contributed with the trial, obtaining informed consents, obtaining samples, obtaining clinical data, and treating and evaluating patients. C.C. reviewed histology. C.B., A.E., C.S. and J.L.R. drafted the manuscript. All authors approved this final version of the manuscript.

Additional Information

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