

2-23-2015

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Citation of this paper:

Yeung, Timothy Pok Chi; Bauman, Glenn; Yartsev, Slav; Fainardi, Enrico; Macdonald, David; and Lee, Ting-Yim, "Dynamic perfusion CT in brain tumors." (2015). *Medical Biophysics Publications*. 53.

<https://ir.lib.uwo.ca/biophysicspub/53>

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Contents lists available at [ScienceDirect](http://www.sciencedirect.com)

European Journal of Radiology

journal homepage: www.elsevier.com/locate/ejrad



Dynamic perfusion CT in brain tumors

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ARTICLE INFO

Article history:

Received 26 December 2014

Accepted 15 February 2015

Keywords:

Dynamic perfusion CT

Brain tumor

Blood flow

Blood volume

Permeability-surface area product

Adiabatic Approximation of Johnson and

Wilson Model

ABSTRACT

Dynamic perfusion CT (PCT) is an imaging technique for assessing the vascular supply and hemodynamics of brain tumors by measuring blood flow, blood volume, and permeability-surface area product. These PCT parameters provide information complementary to histopathologic assessments and have been used for grading brain tumors, distinguishing high-grade gliomas from other brain lesions, differentiating true progression from post-treatment effects, and predicting prognosis after treatments. In this review, the basic principles of PCT are described, and applications of PCT of brain tumors are discussed. The advantages and current challenges, along with possible solutions, of PCT are presented.

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1. Introduction

High-grade gliomas (HGGs), the most common primary brain tumors, are associated with high mortality rates despite aggressive treatments. The median survival for patients with glioblastomas, the most aggressive form of gliomas, is only 12–15 months [1]. HGGs are highly vascular tumors, and tumor vascularity is a determining pathologic hallmark of malignancy [2] that results in characteristic tumor contrast uptake on contrast-enhanced computed tomography (CT) or magnetic resonance imaging (MRI).

Perfusion imaging provides quantitative information about normal brain and tumor physiology that cannot be obtained from conventional morphological imaging. Dynamic perfusion CT (PCT)

is an imaging technique that can quantitatively assesses the vascular supply and permeability of brain tumors by measuring tumor blood flow (BF), blood volume (BV), and permeability-surface area product (PS). PCT is well-suited to study brain tumors due to its widespread availability and low cost, and it is relatively easy to implement compared to Positron emission tomography (PET) and MR perfusion. PCT has been used for grading gliomas, distinguishing gliomas from other brain lesions, differentiating tumor progression from treatment-induced effects, and predicting prognosis after treatments. This review describes the basic principles of PCT and its applications in neuro-oncology. The advantages and challenges of PCT as well as their solutions in brain tumor imaging are presented.

2. Basic principles of PCT

PCT acquires repeated images to track a bolus of iodinated contrast agent as it washes into and out of tissue via blood vessels. The efficient attenuation of X-rays by iodine increases CT image intensity, which is linearly proportional to the iodine concentration [3].

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Table 1
A typical brain tumor PCT protocol.

Parameters	Specifications
Contrast agent	• Iopamidol
Molecular weight of contrast agent	• 777 g/mol (0.777 kDa)
Contrast concentration	• 300 mg Iodine/ml
Contrast dose	• 0.8 ml/kg (60–80 ml in volume for a typical patient)
Rate of contrast injection	• 2–4 ml/s
Scan duration	• 2–3 min
Temporal resolution	• First phase: 1–2 s/image for 45 s Second phase: 15 s/image for 105 s
Tube current	• 100–190 mA
Tube voltage	• 80 kV
Scan coverage	• 4, 8, or 16 cm coverage with multi-detector CT • Shuttle mode can achieve whole brain coverage with 4 or 8 cm multi-detector CT
Scan start time	• 3–5 s after contrast injection

The basis of PCT is to track the delivery of iodine by measuring changes in image intensity after the arrival of contrast bolus.

Table 1 illustrates a typical brain tumor PCT protocol. It is a two-phase scan that takes two to three minutes. The first phase typically takes 45 s to capture the first pass of contrast and requires rapid acquisition of CT images (1–2 s/image) for accurate calculations of BF and BV. The second phase is required for the calculation of PS; it involves less frequent acquisition of CT images (10–15 s/image) to reduce imaging dose.

The calculation of PCT parameters consists of four steps:

1. Subtract baseline signal intensity (prior to contrast arrival) from each CT image to obtain tissue time-enhancement curves $C_t(t)$.
2. Select an input artery that supplies the brain to obtain the arterial input function $C_a(t)$.
3. Select a vein to correct partial volume averaging of the arterial input function $C_a(t)$ [4].
4. Calculate PCT parameters based on the chosen tracer kinetic model of the software.

The different tracer kinetics models can be categorized as follows:

1. Model-independent method based on indicator dilution theory that calculates BF and BV [5]. This is commonly used in dynamic susceptibility-contrast MR (DSC-MR). For brain tumor, the BV obtained has to be corrected for contrast leakage as described by Boxerman [6].
2. Compartmental model accounts for the rate of diffusional exchange of contrast between the intravascular space and the interstitial space (e.g. K^{trans}) besides BV [7]. This is commonly used in dynamic contrast-enhanced MR (DCE-MR). K^{trans} is the product of BF and extraction efficiency (E) and when $PS \ll BF$, as would be the case in brain tumor, it is equal to PS [8].
3. Distributed parameter model, which is commonly used in PCT, calculates BF, BV, and rate of diffusional exchange (PS or K^{trans}) between blood and tissue [8]. K^{trans} can then be calculated as $BF \cdot (1 - \exp(-PS/BF))$ [8].

Here we describe the calculation of PCT parameters based on the distributed parameter model first proposed by Johnson and Wilson and subsequently simplified by St Lawrence and Lee with their adiabatic approximation [9]. The tissue-enhancement curve $C_t(t)$ can be expressed as:

$$C_t(t) = BF \cdot C_a(t) \otimes R(t) \quad (1)$$

where \otimes is a convolution operator, and $R(t)$ represents the impulse residue function (IRF). Fig. 1 illustrates Eq. (1). The IRF describes the fraction of contrast that remains in the tissue as time progresses, following the injection of unit mass of contrast into the arterial input. The product of the IRF and BF is called the BF-scaled IRF, and it is solved by deconvolving the arterial input function $C_a(t)$ with the tissue enhancement curve $C_t(t)$. The BF-scaled impulse residue function has two distinct phases (Fig. 1). The first phase describes the retention of contrast in the tissue prior to any venous outflow; it has a peak height of BF (ml/min/100 g), a width that equals to the mean transit time (MTT, s), and an area that equals to BV (ml/100 g). The second phase describes the backflux of contrast from the interstitial space into the bloodstream. It starts at a height of the extraction fraction (E) and decays monoexponentially with time. PS can be calculated as $PS = -BF \cdot \ln(1 - E)$. PS is the unidirectional diffusional flux of contrast from the intravascular space into the interstitial space across all “openings” of the permeable capillary endothelium.

3. Clinical applications

3.1. Correlation with histopathologic markers and tumor grade

Angiogenesis is important for histopathologic grading of gliomas by providing valuable information for treatment selections and prediction of treatment response. Histopathologic grading of gliomas using biopsied specimens can be prone to sampling error due to the heterogeneity of tumors. It has been shown that 60% of anaplastic astrocytomas (grade III) were upgraded to glioblastoma (grade IV) after comparing the biopsied specimens with the resected tumors [10].

Microvascular density (MVD) and microvascular cellular proliferation (MVCP) are histopathologic markers of angiogenesis. PCT measures of BF and BV have shown significant correlations with MVD ($r = 0.527$ and 0.649 , respectively; $P < 0.02$), while PS showed a significant correlation with MVCP ($r = 0.647$, $P = 0.001$) [11]. These results suggest that regions of higher angiogenic activities (i.e. more aggressive) could be localized by maps of BF, BV, and PS to serve to guide biopsy or resection. While statistically significant, PCT correlations with MVD and MVCP were moderate, possibly because MVD and MVCP cannot fully reflect the complexity of tumor vessels, which are tortuous and variable in size. MR perfusion measure of relative BV (rBV) showed higher correlation with microvessel area (MVA) than MVD ($r = 0.83$ and 0.32 , respectively; $P \leq 0.05$) [12]. More importantly, MVA and rBV correlated with overall survival (OS) ($P < 0.02$) and MVD did not ($P = 0.17$), suggesting rBV and MVA could be superior to MVD for predicting OS. MVA can better reflect the tortuosity and size of vessels, but MVA is not measured routinely because it is time-consuming and labor-intensive. To date, correlations between MVA and PCT have not yet been reported.

Jain et al. explored the relationships between different PCT parameters and the expression levels of genes associated with angiogenesis in glioblastomas [13]. BV and/or PS correlated positively with some proangiogenic genes (e.g. VEGFR-2) and negatively with some anti-angiogenic genes (e.g. VASH2 and C3), suggesting a molecular genetic basis for using PCT to assess glioblastomas.

A number of studies have used PCT for tumor grading. In general, PCT of HGGs (grade III and IV) demonstrated higher BF, BV, and PS than low-grade gliomas (grade II) [11,14–22]. Figs. 2 and 3 illustrate MR and PCT studies of patients with low-grade glioma and HGG, respectively. Table 2 shows the reported sensitivities and specificities of using PCT to differentiate HGGs versus low-grade gliomas. PCT has also been reported to differentiate grade III from grade IV gliomas with PS demonstrating better predictability than BV in

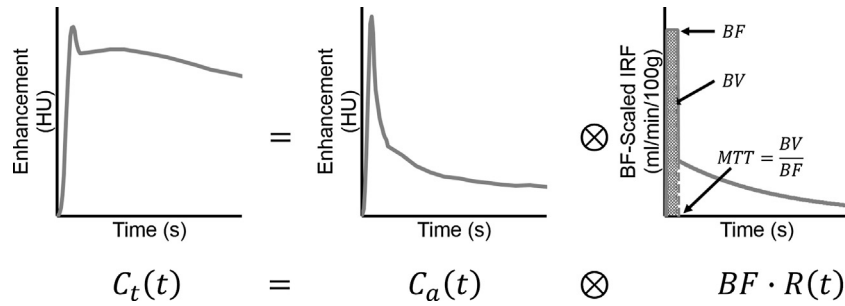


Fig. 1. Graphical illustration showing how different CT perfusion parameters are calculated from a tissue enhancement curve $C_t(t)$ and arterial input function $C_a(t)$.

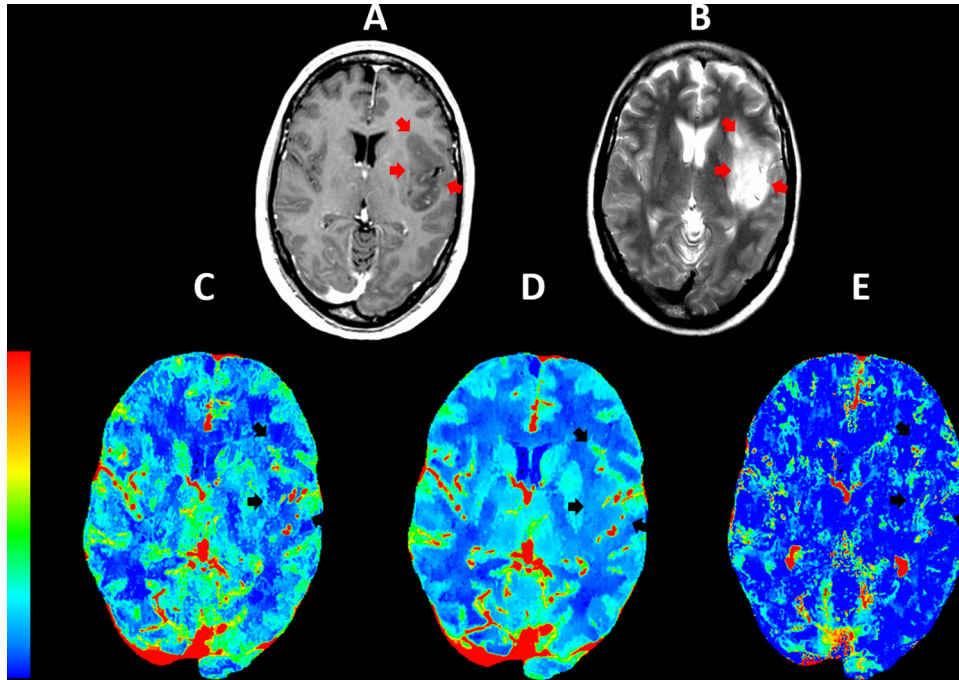


Fig. 2. A patient with grade II diffuse astrocytoma. Post-gadolinium T1-weighted image (A) shows a non-enhancing lesion (red and black arrows) with minimal peritumoral edema on T2-weighted image (B). Maps of blood flow (BF), blood volume (BV), and permeability-surface area product (PS) do not show a region of elevated BF, BV, and PS.

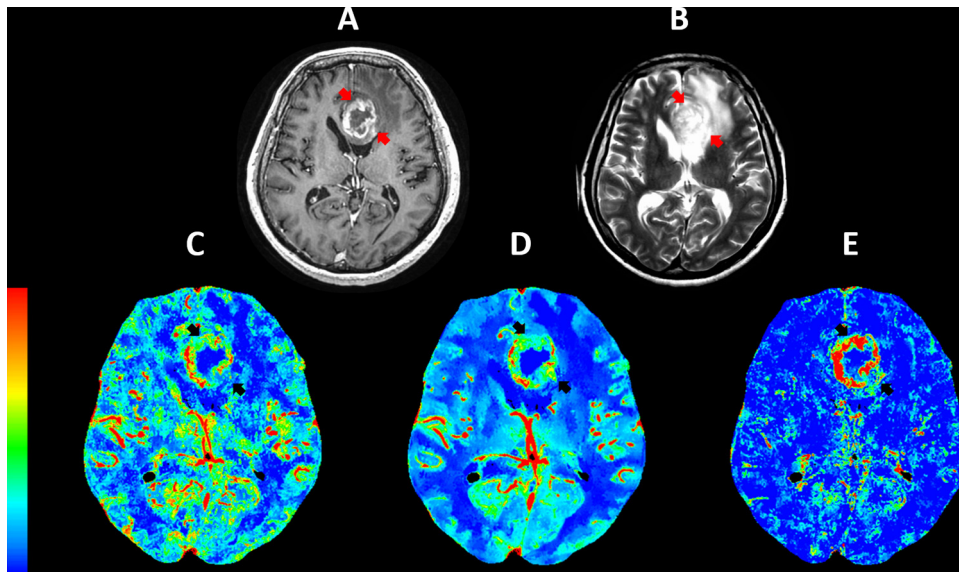


Fig. 3. A patient with grade IV glioblastoma. Post-gadolinium T1-weighted image (A) shows a contrast-enhancing tumor (red and black arrows) and substantial peritumoral edema on T2-weighted image (B). Maps of blood flow (BF), blood volume (BV), and permeability-surface area product (PS) shows a rim with high BF, BV, and PS.

Table 2
The performance of PCT in differentiating high vs. low grade gliomas.

Parameters	Sensitivity ranges (%)	Specificity ranges (%)	References
BF ^a	71–91	82–100	[14,15,18,22]
BV ^a	83–100	75–100	[14,15,18,19,22]
PS	83	100	[19]
MTT	93	40	[18]
K ^{trans}	97	100	[14,22]

Abbreviations: BF, blood flow; BV, blood volume; PS, permeability–surface area product; MTT, mean transit time; K^{trans}, transfer constant.

^a BF and BV refer to absolute values or absolute tumor BF and BV normalized to BF and BV in the normal appearing white matter or contralateral brain region.

this regard (C-statistic = 0.926 and 0.787, respectively) [17]. This is consistent with the correlation between PS and MVCP [11] in that neovascularization is a criterion for diagnosing grade IV gliomas, but not grade III gliomas, suggesting PS is sensitive to detecting immature and leaky tumor vessels. In addition to grading, PS has been shown to improve interobserver agreement of tumor boundary delineation, which is particularly important for tumor targeting by radiotherapy [23].

Up to 9% of HGGs are non-enhancing on post-gadolinium T1-weighted MR, which can be mistaken as low-grade gliomas [24]. Beppu et al. showed that PCT measurement of BV could differentiate non-enhancing grade III gliomas from grade II gliomas with a sensitivity and specificity of 90.9% and 83.3%, respectively [15]. All these studies support the use of PCT as a noninvasive surrogate of tumor grade, which can potentially be used to guide biopsy and resection of gliomas and potentially avoid under-grading non-enhancing HGGs.

3.2. Differentiation of high-grade gliomas from other brain lesions

There are non-malignant and malignant lesions that can appear similar to HGGs on contrast-enhanced MR images. Tumefactive demyelinating lesions (TDLs) are solitary lesions greater than 2 cm that mimic HGGs on contrast-enhanced MR images [25], and can also be confused with HGGs on histopathology [26]. Differentiation of TDLs from HGGs may avoid unnecessary biopsy and resection of viable brain tissue. Using PCT, TDLs showed significantly lower BF, BV, and PS than HGGs [27]. These results are consistent with the observations that TDLs are characterized by normal or inflamed vessels and a lack of vascular proliferation while the latter is common in HGGs [26].

Primary brain lymphomas, brain metastases, and HGGs are malignant lesions that can appear similar to each other on MR images. HGGs showed significantly higher BV and BF than primary brain lymphomas, suggesting PCT may have utility in differentiating the two entities [22,28]. However, Fainardi et al. showed that there was no significant difference in tumor BV and PS between HGGs and metastases [16]. Previous DSC-MR studies showed that tumor BV values from brain metastases were either similar to or lower than HGGs [29,30]. Thus, it may be difficult to distinguish metastases from HGGs using tumor BV. DSC-MR studies that focused on the peritumoral edema regions of tumors (hyperintense regions on T2-weighted MR) found that BV values in these regions were significantly higher in HGGs than brain metastases [30,31]. This observation suggests a possibility to distinguish HGG and brain metastases by evaluating BV in the peritumoral edema region. The high BV in the peritumoral edema region of HGG could be attributed to its infiltrative growth while tumor infiltration is not a characteristic feature of brain metastasis [32].

Table 3
Differentiation of treatment-induced necrosis from true progression of brain tumors.

Parameters	Sensitivity ranges (%)	Specificity ranges (%)	References
^a Relative BF	94%	88%	[38]
^a Relative BV	71–83%	90–100%	[38–40]
PS	82%	82%	[39]
Relative MTT	94%	75%	[38]

Abbreviations: BF, blood flow; BV, blood volume; PS, permeability–surface area product; MTT, mean transit time.

^a Relative BF and BV refer to absolute tumor BF and BV normalized to BF and BV in the normal appearing white matter or contralateral brain region.

3.3. Differentiation of true progression from post-treatment effects

An increase in the size of the contrast-enhancing tumor is a radiologic measure of progression, but the effects of radiotherapy can also mimic the appearance of true progression on contrast-enhanced MR images [33]. Pseudoprogression and treatment-induced necrosis (TIN) are two post-radiotherapy scenarios that mimic true progression on MR. It is imperative to differentiate these entities accurately since they are managed differently.

Although the mechanism of pseudoprogression is unclear, it is believed to be induced by a local inflammatory reaction, edema, and increased vessel permeability that lead to contrast enhancement on imaging [33]. Previous DSC-MR studies showed that true progression had significantly higher relative BV (rBV) than pseudoprogression [34,35] and TIN [36,37]. Using PCT, true progression showed significantly higher values of rBF, rBV, and PS than TIN [38–40]. Sensitivities and specificities of >80% were measured using PCT to differentiate true progression from TIN in brain tumors (Table 3). Fig. 4 shows a PCT study of a patient with progression 6 months after radiotherapy, and Fig. 5 shows a patient with histopathologically confirmed radiation necrosis 3 months after radiotherapy.

PCT offers an advantage over MR perfusion in this regard since it can measure all three vascular parameters—BF, BV and PS, which is technically challenging for DSC-MR and DCE-MR. True progressive brain tumors are malignancies with increased vascularity, immature leaky vessels, and upregulated VEGF expression resulting in higher BF, BV and PS. On the other hand, the moderate PS observed in TIN is likely mediated by the release of VEGF in the pathogenesis of radiation necrosis [41]. In addition, susceptibility artefacts from blood products (hemorrhage, thrombus) and calcification can potentially complicate the analysis of DSC-MR studies while PCT is not affected by these artefacts [39,42].

3.4. Prediction of prognosis

Recently, PCT parameters have been used to predict overall survival (OS) after surgery/biopsy, radiotherapy, and temozolomide chemotherapy. Pre-treatment PCT exams showed that tumor relative BV alone [43], PS alone [44], and relative BV + PS were all predictive of OS [43,44]. More importantly, rBV alone and rBV + PS remained significant predictors of OS even after adjusting for classical prognostic factors (age, Karnofsky performance status, extent of resection, and grade) [43], suggesting that PCT parameters could improve the prediction of OS.

Local recurrence within 2 cm of the irradiated volume predominates post-radiotherapy, making imaging assessments of both the contrast-enhancing tumor and the peritumoral edema region critical [45]. Yeung et al. showed that patients with shorter OS had higher BV and PS in both regions than patients with longer OS (Fig. 6), and that post-radiotherapy BV in the peritumoral edema

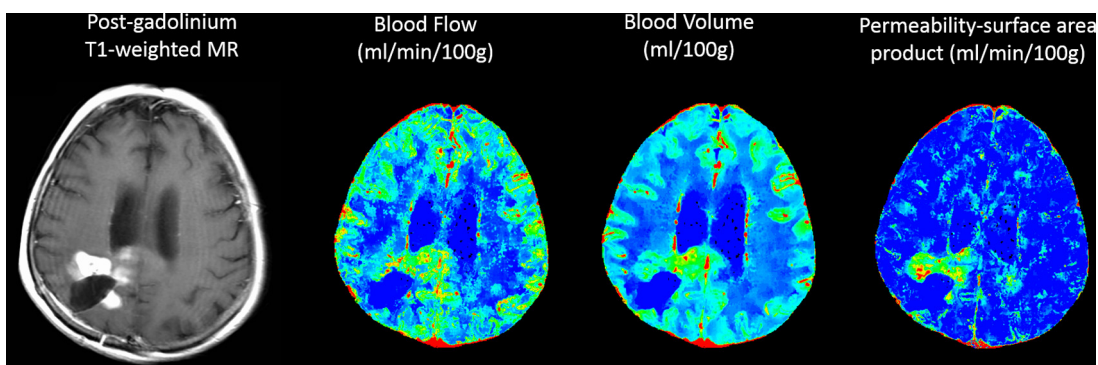


Fig. 4. A patient who was previously treated for a glioblastoma multiforme shows a progressive enhancing lesion (T1-weighted MR) with high blood flow (BF), blood volume (BV), and permeability-surface area product (PS) suggesting progressive tumor around the surgical cavity at 6 months post-radiotherapy.

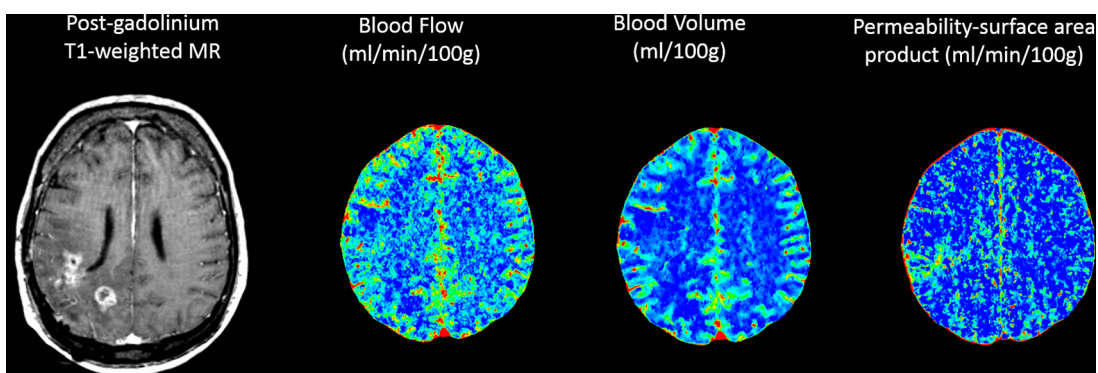


Fig. 5. A patient with histopathologically confirmed radiation necrosis shows a progressive enhancing lesion (T1-weighted MR) with low blood flow (BF), blood volume (BV), and permeability-surface area product (PS).

region could predict 24 months OS with sensitivities and specificities >80% [46]. Similar results have been demonstrated in DSC-MR studies [47,48]. These findings highlight the importance of paying attention to the peritumoral edema region. Radiotherapy targeting of the peritumoral edema region with PCT image-guidance may be a viable option that is worth exploring. PCT can play an important role in radiation oncology since CT imaging is required for radiotherapy treatment planning.

4. Discussion: strengths and challenges of PCT

DSC-MR is currently the most commonly used perfusion imaging technique for assessing brain tumors. However, PCT has several advantages that make it a useful alternative functional imaging tool. The linear relationship between signal intensity (HU) and iodine concentration is a major strength of PCT. DSC-MR with T2 or T2*-weighting is prone to two types of artefacts. DSC-MR

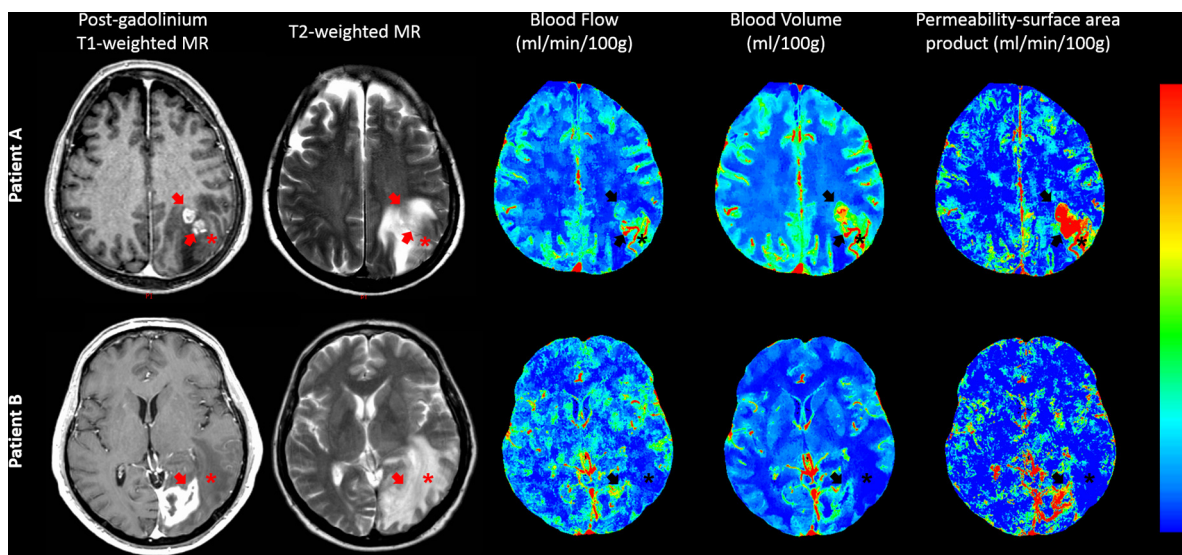


Fig. 6. CT perfusion and MR images of patients with glioblastomas. Both patients presented with a contrast-enhancing tumor (red and black arrows) on post-gadolinium T1-weighted MR images that had high blood flow (BF), blood volume (BV), and permeability-surface area product (PS). Patient A also presented with regions of high BF, BV, and outside the contrast-enhancing tumor (red and black asterisks). Survival for Patient A was 16.7 months. Patient B presented with low BF, BV, and PS in the peritumoral region outside the contrast-enhancing tumor (red and black asterisks). Survival for patient B was 41.6 months.

measurement of BV depends on the compartmentalization of contrast within blood vessels. In brain tumors where considerable amount of contrast can leak into the interstitial space, the susceptibility-contrast signal intensity loss can be masked by the competing T1 effects [6]. DSC-MR measurement leads to an underestimation of BV if it is not addressed by (1) pre-saturating the brain parenchyma with a pre-loading dose of contrast, (2) dual-echo sequence, or (3) post-processing correction [6,42]. This effect also makes the quantification of tumor permeability technically challenging. In addition, the susceptibility artefacts created by blood products (from hemorrhage and thrombus) in tumors are other factors that can affect the quantification of BV. PCT is clearly advantageous in this respect.

The second major advantage of PCT is the capability to measure BF, BV, and PS from a single scan. The measurements of BF and BV require rapid image acquisitions (1–2 s per image), which is technically challenging for T1-weighted DCE-MR. For DSC-MR, the effect of contrast extravasation on signal intensity makes the calculation of PS difficult to achieve as discussed above. Furthermore, measuring the arterial input function needed for calculating absolute values of BF and BV is problematic with MR perfusion due to the trade-off between spatial and temporal resolutions. The high spatial and temporal resolutions of CT scanning and the linearity between iodine concentration and CT image intensity enable the calculation of BF, BV, and PS from a single PCT study.

MR is the standard of care for brain tumor patients; hence, the follow-up of patients with MR perfusion is more convenient than PCT as perfusion imaging can be included as part of a single multi-parametric MR study. The clinical use of PCT has also been slow to progress due to two major limitations. Radiation dose is of concern when performing a PCT scan. The effective doses with current techniques are between 2.5 and 5.5 mSv for tube currents of 100–190 mA [49]. Recent advances in adaptive statistical iterative reconstruction can reduce imaging dose without compromising the diagnostic acceptability [50]. An image filtering technique called principal component analysis can also improve PCT image quality; thereby presenting another opportunity for further dose reduction [51]. The limited scan coverage (2–4 cm coverage) is another limitation of PCT, making whole tumor assessment difficult. However, the advent of shuttle mode imaging and large multi-row detector technology enables whole brain PCT coverage [52,53]. Differences in PCT protocol (e.g. PCT scan duration) and calculation software could lead to disagreements in the values of PCT parameters [49,54]. Therefore, standardization of PCT protocol and software are critical for cross-study comparison.

5. Conclusions

PCT can provide tumor hemodynamics information for pre-operative tumor grading, response assessment, and OS prediction. Results from PCT studies are comparable to those performed with MR perfusion. PCT is technically less demanding than MR perfusion and provides measurements of BF, BV, and PS from a single scan. The obstacles of limited scan coverage and radiation dose are being addressed by recent advances in CT imaging. In our opinion, PCT has reached sufficient technical maturity for use as a routine functional imaging tool for brain tumor assessment.

Conflict of interest

T-Y Lee licenses CT Perfusion software to GE Healthcare and receives royalties from the license. The software was used to generate the Figures in the article. Other authors do not have conflicts to declare.

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