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# Cerebral oxygen extraction fraction (OEF): comparison of dualgas challenge calibrated BOLD with CBF and challenge-free gradient echo QSM+qBOLD

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# Abstract

**Purpose:** To compare cortical gray matter OEF estimated from two MRI methods: 1) the quantitative susceptibility mapping plus quantitative blood oxygen level-dependent magnitude (QSM+qBOLD or QQ) and 2) the dual-gas calibrated-BOLD (DGCB) in healthy subjects, and to investigate the validity of iso-CMRO<sub>2</sub> assumption during hypercapnia using QQ.

**Methods:** In ten healthy subjects, 3T MRI including a multi-echo GRE sequence at baseline and hypercapnia for QQ, as well as an EPI dual-echo pseudo-continuous arterial spin labeling (pCASL) for DGCB were performed under a hypercapnic and a hyperoxic condition. OEFs from QQ and DGCB were compared using ROI analysis and paired t-test. For QQ, CMRO<sub>2</sub>=CBF\*OEF\*Ca (Ca=arterial oxygen content) was generated for both baseline and hypercapnia, which were compared.

**Results:** Average OEF in cortical gray matter (CGM) across 10 subjects from QQ vs DGCB were  $35.5 \pm 6.7$  vs  $38.0 \pm 9.1$  % (*P*=0.49) at baseline; and  $20.7 \pm 4.4$  vs  $28.4 \pm 7.6$  % (*P*=0.02) in hypercapnia: OEF in CGM was significantly reduced as measured in QQ (*P*<0.01) and in DGCB (*P*<0.01). CMRO<sub>2</sub> (in µmol O<sub>2</sub>/min/100g) was  $168.2 \pm 54.1$  at baseline from DGCB; and  $153.1 \pm 33.8$  at baseline and  $126.4 \pm 34.2$  (*P*<0.01) in hypercapnia from QQ.

**Conclusions:** The differences in OEF obtained from QQ and DGCB are small and non-significant at baseline, but are statistically significant during hypercapnia. In addition, QQ shows a CMRO<sub>2</sub> decrease (17.4%) during hypercapnia.

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Data Availability Statement: The code that supports the findings of this study will be openly available at http:// pre.weill.cornell.edu/mri/.

#### Keywords

oxygen extraction fraction; OEF; cerebral metabolic rate of oxygen; CMRO<sub>2</sub>; quantitative susceptibility mapping; QSM; quantitative blood oxygenation level-dependent imaging; qBOLD; QSM+qBOLD; QQ; dual-gas calibrated BOLD; DGCB

# INTRODUCTION

Cerebral metabolic rate of oxygen consumption (CMRO<sub>2</sub>) and oxygen extraction fraction (OEF) are essential biomarkers for tissue viability and function, and are thought to be altered in various diseases, such as stroke (1–4), tumor (5), and Alzheimer's Disease (6). In MRI, a variety of quantitative models have been proposed to estimate CMRO<sub>2</sub> and OEF either from 1) MR magnitude signal, such as quantitative BOLD (qBOLD) (7,8), quantitative imaging of extraction of oxygen and tissue consumption (QUIXOTIC) (9), and calibrated BOLD (10–13), or 2) MR phase signal, including whole brain susceptometry-based oximetry (14,15) as well as macrovascular (16–18) and microvascular (19–21) OEF quantification using quantitative susceptibility mapping (QSM) methods.

Calibrated BOLD is a quantitative modeling of deoxyhemoglobin concentration [dHb] using the MR magnitude signal (13). It isolates the CMRO<sub>2</sub> contribution from the BOLD signal, a complex function of cerebral blood flow (CBF), cerebral blood volume (CBV), and CMRO<sub>2</sub>, with the aid of respiratory challenges. When a single respiratory challenge is used, relative CMRO<sub>2</sub> change associated with a task can be quantified. With more than one respiratory challenge, such as dual-gas calibrated BOLD (DGCB) that combines hypercapnia and hyperoxia, baseline absolute CMRO<sub>2</sub> can be estimated. In step-wise DGCB, the maximum BOLD response, M, can be obtained first from hypercapnia with an iso-CMRO<sub>2</sub> assumption. With the obtained M, the baseline OEF is then estimated based on BOLD and CBF changes under hyperoxia (12,22).

On the other hand, the QSM-based microvascular OEF method is a quantitative modeling of [dHb] using MR phase signal (19–21). QSM modeling of biological iron (23,24) forms allows extraction of [dHb] contribution from the voxel-wise susceptibility values by employing a vascular challenge (19,21,25), using a local minimization method (20), or combining with qBOLD (QSM+qBOLD or QQ) for a comprehensive modeling on both magnitude and phase of multi-echo gradient echo (mGRE) data (26). QQ can quantify OEF and CMRO<sub>2</sub> without vascular challenges, hence it is more practical in a clinical setting. The robustness of QQ against measurement noise can be further improved with cluster analysis of time evolution (CAT) (27).

In this study, we aim to cross-validate QQ-CAT with DGCB for OEF measurement in cortical gray matter in healthy subjects. In addition, because QQ does not require a vascular challenge, it can measure OEF at both baseline and hypercapnia independently. Hence, we investigate the debated assumption that CMRO<sub>2</sub> is unchanged during hypercapnia, which is of great interest for future calibrated BOLD studies.

# **METHODS**

#### **Data Acquisition**

MRI was performed in 10 healthy subjects (5 female subjects, age  $29 \pm 5$  years) on a Siemens Tim Trio 3 T scanner with a 32-channel RF receiver head coil after providing informed written consent. The study was approved by the Research Ethics Board of the Montreal Neurological Institute and Hospital.

For QQ data, a 3D MPRAGE sequence with 1 mm<sup>3</sup> voxel size was used to acquire an anatomical image. A 3D multi-echo gradient echo (mGRE) sequence with flow compensation along all three axes was used to generate quantitative susceptibility maps (28). The 3D mGRE sequence parameters were: 1 mm in-plane resolution, 1 mm slice thickness, 7 equally spaced echoes:  $TE_1/TE/TE_7 = 4.6/4.06/29.0$  ms, TR= 32 ms, monopolar readouts with a bandwidth of 977 Hz/pixel, flip angle 20°, GRAPPA acceleration factor = 2, phase partial Fourier = 3/4. The mGRE complex images from all 32 channels were combined using the singular value decomposition method to avoid the open-ended fringeline (29). GRE data were acquired at baseline and during a hypercapnic condition to prospectively target partial pressure of end-tidal CO<sub>2</sub> (PetCO<sub>2</sub>) to 7 mmHg above the participant's baseline using a computerized gas-delivery system RespirAct (Thornhill Research Inc., Toronto, ON, Canada).

DGCB data were collected using an EPI dual-echo pseudo-continuous arterial spin labeling (pCASL) sequence with TR/TE<sub>1</sub>/TE<sub>2</sub> = 4000/10/30 ms, voxels = 3.9 mm isotropic, label duration = 1665, post-label delay = 900/1568/2235 ms (first/center/last slice), GRAPPA = 2, phase partial Fourier =7/8, 25 slices, labelling location =10 cm below the central slice, and descending slice acquisition order. For quantifying resting CBF and OEF, dual-echo pCASL data were acquired under a baseline condition, a hypercapnic challenge condition, and two hyperoxic conditions. Gas manipulations were achieved with the RespirAct system. For hypercapnia, an increased PetCO<sub>2</sub> of 7 mmHg above participant's baseline was targeted (56 s baseline, 56 s hypercapnia, 120 s baseline, 120 s hypercapnia and 56 s baseline) while 102 volumes of pCASL EPI data were acquired with an acquisition time of 7 mins. Hyperoxic gas manipulation aimed to increase PetO<sub>2</sub> by 150 mmHg and 300 mmHg above participant's baseline (120 s baseline, 120 s of PetO<sub>2</sub> +150 mmHg hyperoxia, 120 s of PetO<sub>2</sub> +300 mmHg hyperoxia, and 56 s baseline). 120 volumes of pCASL EPI data were acquired during hyperoxia with an acquisition time of 8 mins and 12 seconds.

For each subject, the arterial oxygenation,  $Y_a$ , was measured with a pulse oximeter (Oxyn Vantage, Nonin Medical Inc.) and heme molar concentration [*H*] was obtained with performing complete blood count on forearm blood sample.

#### Data processing

**CBF quantification from ASL data:** pCASL data were processed with the SPM8 ASLtbx for baseline CBF calculation. Baseline CBF was then registered and resampled to QSM resolution. CBF cerebrovascular reactivity (CVR), i.e. the fractional CBF change induced by unit PetCO<sub>2</sub>, maps were calculated using the pCASL hypercapnia data. The CVR maps were then multiplied by the measured PetCO<sub>2</sub> during hypercapnia QSM

acquisitions and added to the baseline CBF to infer CBF during hypercapnic QSM acquisitions.

QQ OEF and CMRO<sub>2</sub> mapping from GRE data at baseline and at hypercapnia separately: The OEF map was estimated by the QQ model, consisting of QSM of phase and qBOLD of magnitude of mGRE data as detailed in (27). QSM reconstruction was performed as follows: first, a linear fit of the mGRE phase was performed to estimate the total field (30). Second, the Laplacian boundary value (LBV) was used to obtain the local field (31). Finally, Morphology Enabled Dipole Inversion with automatic uniform cerebrospinal fluid zero reference (MEDI+0) algorithm was used to compute susceptibility (32-37). The mGRE magnitude was modeled according to qBOLD and further denoised according to the cluster analysis of time evolution (CAT) by following the approach outlined by Cho et al. (27) with incorporating tissue type information by tripling the number of clusters into gray matter (GM), white matter (WM), cerebrospinal fluid (CSF) clusters and without the OEF regularization in the QQ-CAT optimization. The cluster-specific v values are initialized to be 4/2/0% for GM/WM/CSF clusters. The GM/WM/CSF segmentation is performed by FSL FAST (38) with the echo-combined magnitude image of mGRE. The straight sinus mask in the processing was obtained automatically using global and regional thresholding on QSM combined with positional (inferior, posterior brain) and geometrical (straightness of the vein) constraints at baseline as described in (27) and was visually checked. For hypercapnia, the straight sinus mask at baseline was registered using the FSL FLIRT algorithm (39,40).

DGCB OEF mapping at baseline and hypercapnia and CMRO<sub>2</sub> assumed

invariant during hypercapnia: DGCB data were analyzed as detailed in (25). The steady-state values of PetCO<sub>2</sub> and PetO<sub>2</sub> were obtained via linear regression on the entire hypercapnic (PetCO<sub>2</sub>) and hyperoxia (PetO<sub>2</sub>) run, respectively. The steady-state end-tidal values were then used to form boxcar functions and convolved with a single gamma function (standard deviation of 20 s and mean lag time of 40 s) to be used as regressors for BOLD and CBF modeling in the general linear model (GLM) using FSL FEAT (39-43). For BOLD data, an additional linear and zig-zag regressor was included to account for linear signal drift and for the tag and control signal differences, respectively. For CBF data, first echo of pCASL data were sinc subtracted and low-pass filtered with cut-off frequency of 0.125 Hz to filter out high-frequency noise prior to GLM. For BOLD data during the hyperoxic run, the end-tidal CO<sub>2</sub> trace was included as an additional regressor to reduce the influence of any CO<sub>2</sub> changes on BOLD responses because small increases in end-tidal CO<sub>2</sub> temporarily occurred during transitions of hyperoxia challenges. From the GLM analysis, the percentage signal changes of BOLD and CBF associated with hypercapnia were extracted and used to calculate M according to the Davis model (44). The hyperoxic BOLD fractional signal change at  $PetO_2 = +300$  mmHg was extracted from GLM. Because of the low SNR in pCASL scans, the percentage signal changes of CBF associated with hyperoxia (+300 mmHg PetO<sub>2</sub>) were assumed to be -3.11% as suggested in (12). Baseline OEF values were then derived from M, hyperoxia BOLD and CBF changes according to Bulte et al. (22). The OEF in hypercapnia was calculated with 1) the baseline OEF, 2) baseline CBF, and 3) hypercapnia CBF based on the iso-CMRO<sub>2</sub> assumption.

#### **ROI** analysis

Comparisons of OEF measures between QQ-OEF and DGCB-OEF were performed in cortical gray matter (CGM). The CGM was automatically segmented using the atlas derived from (45), and retaining the voxel with 1) significant BOLD and CBF responses to hypercapnia and significant BOLD responses to hyperoxia (z > 2.3), 2) plausible OEF (from 0 to 1), and 3) realistic CMRO<sub>2</sub> (from 0 to 1000). For ROI analysis of the QQ result, the obtained CGM mask was resampled to the QSM data resolution and overlapped with the GM mask made in the QSM resolution using FSL FAST (38) with the echo-combined magnitude image from mGRE. Histograms of OEF values were computed and compared between methods.

# RESULTS

Hypercapnia gas manipulations resulted in the end-tidal CO<sub>2</sub> increase in all subjects. Close to the targeted PetCO<sub>2</sub> (+7 mmHg), average PetCO<sub>2</sub> increase was  $5.8 \pm 1.2$  and  $6.3 \pm 1.0$  mmHg for the calibrated BOLD scans and for QSM scans, respectively. PetCO<sub>2</sub> increase between the two methods were not significantly different (*P*=0.2). Hyperoxia gas manipulations increased PetO<sub>2</sub> in all subjects for an average end-tidal O<sub>2</sub> increase of 277.1 ± 23.7 mmHg for the targeted PetO<sub>2</sub> = +300 mmHg.

Figure 1 shows OEF maps in two subjects at baseline (BL) and hypercapnia (HC) for DGCB and QQ. Compared to DGCB, QQ showed more uniform OEF. At BL, QQ showed similar average OEF values compared to DGCB in CGM (Table 1) (N=10):  $35.5 \pm 6.7$  and  $38.0 \pm 9.1 \%$  (*P*=0.49). However, for HC, QQ showed lower OEF values than DGCB (Table 1):  $20.7 \pm 4.4$  vs  $28.4 \pm 7.6 \%$  (*P*=0.02). Compared to BL, HC showed significantly reduced OEF in CGM for both QQ (*P*<0.01) and DGCB (*P*<0.01).

Figure 2 shows CMRO<sub>2</sub> and CBF in the same two subjects at BL and HC for DGCB and QQ. QQ showed a good CMRO<sub>2</sub> contrast between gray and white matter without extremely high values. At BL, the QQ estimated CMRO<sub>2</sub> was not significantly different than that obtained with DGCB in CGM (Table 1):  $153.1 \pm 33.8$  and  $168.2 \pm 54.1 \mu mol O_2/min/100g$  (*P*=0.36). In HC, QQ showed lower CMRO<sub>2</sub> compared to BL:  $126.4 \pm 34.2 \mu mol O_2/min/100g$  (*P*=0.36). In HC, QQ showed lower CMRO<sub>2</sub> is identical to BL-CMRO<sub>2</sub> in DGCB (iso-CMRO<sub>2</sub> assumption). Note that HC-CMRO<sub>2</sub> is identical to BL-CMRO<sub>2</sub> in DGCB (iso-CMRO<sub>2</sub> assumption). In addition, higher CBF and venous blood volume (*v*) were measured during HC compared to BL (Table 2):  $82.4 \pm 11.8 \text{ vs } 56.8 \pm 9.8 \text{ ml/min}/100g$  (*P*<0.01) for CBF and  $3.1 \pm 0.5 \text{ vs}$ .  $2.8 \pm 0.4 \%$  (*P*=0.35) for *v* (Supporting Information Figure S3). Histograms of OEF values for QQ and DBCB in two subjects are shown in Figure S4 in Supporting Information.

Hypercapnia gas manipulations increased gray matter CBF and BOLD signals in all subjects, on average,  $38.6 \pm 7.4$  % for CBF and  $2.3 \pm 0.5$  % for BOLD. Average CBF cerebrovascular reactivity (CVR) in gray matter was  $7.3 \pm 1.8$  %CBF/mmHg PetCO<sub>2</sub> (Table 2).

## DISCUSSION

In this study, the QSM+qBOLD (QQ) OEF mapping method without challenge was compared with dual gas calibrated BOLD (DGCB) OEF mapping and was used to evaluate CMRO<sub>2</sub> change during hypercapnia. Although the DGCB is not a gold standard technique for baseline OEF measurement, it is the first established quantitative OEF technique in MRI. Our results indicate that QQ model provided similar OEF values in CGM compared to the DGCB at baseline. Based on this validation, the advantages of QQ, e.g. OEF estimation without a gas inhalation challenge, enables the application of QQ in clinical settings. Furthermore, because no challenge was required, QQ was able to quantify OEF and CMRO<sub>2</sub> values independently at baseline and during hypercapnia. QQ showed a 17.4% CMRO<sub>2</sub> decrease during hypercapnia. This observation is an important contribution to the debate surrounding the iso-CMRO<sub>2</sub> assumption employed in hypercapnia calibrated BOLD studies. The QQ method provides a framework to probe this issue further (e.g. graded hypo- and hypercapnia) and to determine the effects of oxygen manipulations on CMRO<sub>2</sub>.

Baseline OEF in CGM estimated with the two methods were similar and statistically not significantly different (Table 1):  $35.5 \pm 6.7$  and  $38.0 \pm 9.1$  % (*P*=0.49) for QQ and DGCB, respectively. Both OEF values fell within the range previously reported using PET:  $35 \pm 7$  % (46) and  $40 \pm 9$  % (47), using calibrated BOLD:  $35 \pm 4 - 44 \pm 14$  % (Table 3 in (25)), and using QSM:  $29 \pm 3 - 50 \pm 5$  % (Table 4 in (25)).

Compared to the QQ OEF, the DGCB OEF showed greater inter-subject variation (coefficient of variation in CGM = 19% for QQ vs 24% for DGCB), though their group averages at baseline were close (Figure 1 and Table 1). A similar inter-subject variation was also shown in a previous DGCB study (12), and may be attributed to low SNR in BOLD and, in particular, CBF signals in DGCB measurement. Employing an additional gas manipulation such as carbogen might help to decrease the inter-subject variability (48). On the other hand, the small OEF variation in QQ (Figures 1 and 2 and Table 1) may have benefited from the usage of cluster analysis of time evolution (CAT) which improves SNR effectively.

QQ results in relatively uniform OEF values in gray and white matter (Figure 1), which agrees well with previous PET studies (47,49,50). For DGCB, the OEF image quality is visually much more variable than the QQ OEF maps (Figure 1). The DGCB OEF map is not valid in white matter due to the low and very low SNR in the white matter BOLD and CBF measurements, respectively.

The OEF in CGM during hypercapnia from the two methods were different (Table 1):  $20.7 \pm 4.4$  and  $28.4 \pm 7.6 \%$  (*P*=0.02) for QQ and DGCB, respectively. The higher OEF in DGCB may be due to the fact that it was estimated using iso-CMRO<sub>2</sub> assumption. QQ showed a CMRO<sub>2</sub> decrease during hypercapnia compared to baseline, leading to lower hypercapnia OEF with QQ than DGCB, with the same level of CBF (Tables 1 and 2). CMRO<sub>2</sub> decrease with hypercapnia is consistent with a CMRO<sub>2</sub> increase with hypocapnia (51). However, hypercapnia may involve multiple mechanisms affecting cerebral metabolic activity with their net effects on CMRO<sub>2</sub> dependent on the brain condition and region. Decreases,

increases and no significant change in CMRO<sub>2</sub> during hypercapnia has been reported in literature (52–55). However, in calibrated BOLD, CMRO<sub>2</sub> is often assumed to be unchanged during hypercapnia (13). Because QQ quantifies OEF independently at baseline and hypercapnia, the discrepancy on CMRO<sub>2</sub> assumption was further investigated in this study. With a moderate hypercapnia gas manipulation (targeted PetCO<sub>2</sub> =+7 mmHg) used in this study, QQ showed a 17.4% CMRO<sub>2</sub> reduction in CGM. This is in line with a recent study suggesting 10~15 % reduction with the similar hypercapnic level (55). The QQ model showed significantly lower OEF in hypercapnia (Figures 1 and 2 and Table 1) than baseline, which is consistent with the calibrated BOLD literature (10,44). Future calibrated BOLD studies could include this mild reduction of CMRO<sub>2</sub> induced by hypercapnia in its model.

In this study, the *v* values in CGM were increased under hypercapnia compared to baseline,  $2.8 \pm 0.4$  vs.  $3.1 \pm 0.5$  % (Table 2 and Supporting Information Figure S3). This suggest that the *v* estimated from QQ-CAT may be sensitive to the physiological difference between baseline (BL) and hypercapnia (HC), as well as OEF. However, the *v* increase at HC compared to BL is not statistically significant (*P*=0.35) and greater (11%) than the expected *v* increase (7%) based on the Grubb relationship: rv (the *v* ratio between HC and BL) =  $rCBF^{0.18}$  (56). The *v* uncertainty might be related to that the *v* outcome from QQ-CAT is approximately four times more sensitive to errors including noise than the OEF output. The sensitivity of OEF to the *v* bias was investigated by processing HC with setting HC-*v* to the expected value,  $rv \times BL$ -*v*. The resultant OEF with using the Grubb relationship for *v* was not significantly different from the OEF value in this study, 19.8 ± 3.4 vs. 20.7 ± 4.4 (*P*=0.21). This suggests that OEF is not that sensitive to the *v* bias.

This study has a number of limitations. First, the results for both DGCB and QQ may be affected by the partial volume effect of vasculatures with tissue and large veins. In QQ, qBOLD model may be inadequate for large veins, which may be handled by imposing 100% venous blood volume at those voxels fully occupied by veins. The partial volume effect may be more severe in DGCB due to lower resolution than QQ (isotropic 3.9 mm vs 1.0 mm). Hence, for ROI analysis, venous blood voxels with large BOLD signal increases (> 10 %) during hypercapnia were excluded in DGCB data. The same mask was also used for QQ to avoid overestimation of OEF. Second, the DGCB OEF results and all CMRO2 reported here may be affected errors in cerebral blood flow measured by PCASL. There was a potentially decreased tagging efficiency in PCASL due to increased blood flow during hypercapnia. This would lead to underestimation in fractional CBF change, which causes OEF overestimation in DGCB. With the hypercapnic levels in this study, tagging efficiency can be reduced by 9% (57), leading to a 9% underestimation in the fractional CBF change, then a 6% overestimation in OEF. With taking this into account, the adjusted average OEF in CGM measured by DGCB would be 35.7%, which agrees well with that measured by OO (35.5%). This source of error may be mitigated by employing an additional phase-contrast scan to measure the flow velocity in feeding arteries at baseline and during hypercapnia for an accurate assessment of tagging efficiency on a subject-by-subject basis. There were a range of post-label delays used our 2D PCASL acquisition: the first slice was acquired with a postlabel delay (PLD) of 900 ms; the centre slice was acquired with a PLD of 1568 ms, close to the recommended 1800 ms PLD. The slightly shorter PLD was selected to accommodate the hypercapnic acquisitions in which arterial transit time was known to decrease. In addition, to

avoid overestimating CBF in macrovascular structures, possibly due to the short PLD, we excluded large arteries that showed larger reductions of CBF during hyperoxia (more than 50 mL/100 g/min) due to the T1-shortening by dissolved oxygen in arterial blood plasma and vessel constriction. The CBF values in the final ROIs are  $15 \sim 99 \text{ mL}/100 \text{g/min}$  with an average of 55 mL/100 g/min, which agrees the expected GM CBF range of healthy subjects. Finally, CMRO<sub>2</sub> change during hyperoxia in patients remains to be investigated by QQ in the future, but it is beyond the scope of this study.

In conclusion, our study cross-validated QQ model with the established DGCB. DGCB and QQ OEF values were in agreement for baseline conditions with QQ showing a lower intersubject variability. Furthermore, QQ results showed a mild (17.4%) decrease in CMRO<sub>2</sub> with hypercapnia.

#### Supplementary Material

Refer to Web version on PubMed Central for supplementary material.

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## Figure 1.

OEF maps from DGCB and QQ between baseline (BL) and hypercapnia (HC) in two subjects. In DGCB, HC-OEF was estimated based on the iso-CMRO<sub>2</sub> assumption with BL-OEF, BL-CBF, and HC-CBF. QQ shows more uniform OEF than DGCB. Both QQ and DGCB shows decreased OEF in HC compared to BL. The unit of color scale is %. Results of all 10 subjects are illustrated in Supporting Information Figures S1 and S2.



#### Figure 2.

CMRO<sub>2</sub> maps from DGCB and QQ and CBF maps between baseline (BL) and hypercapnia (HC) in the same two subjects as in Figure 1. QQ shows good CMRO<sub>2</sub> contrast between gray and white matter. QQ shows decreased CMRO<sub>2</sub> in HC compared to BL. Note that DGCB-CMRO2 in HC is identical to the one at BL (iso-CMRO<sub>2</sub> assumption). The BL-CBF was obtained by registering DGCB-CBF to QSM resolution. The HC-CBF was inferred based on the cerebrovascular reactivity (CVR) obtained from DGCB during hypercapnia and PetCO<sub>2</sub> obtained from QSM during hypercapnia. The unit of color scale is  $\mu$ mol O<sub>2</sub>/min/100g for CMRO<sub>2</sub> and ml/min/100g for CBF. Results of all 10 subjects are illustrated in Supporting Information Figures S1 and S2.

#### Table 1.

Average and standard deviation of OEF and CMRO<sub>2</sub> in CGM. The unit of OEF and CMRO<sub>2</sub> is % and  $\mu$ mol O<sub>2</sub>/min/100g, respectively. BL and HC indicate baseline and hypercapnia, respectively.

		0	EF	CMRO2			
	DGCB		QQ		DGCB	QQ	
Subject #	BL	нс	BL	нс	BL=HC	BL	нс
1	$48.9 \pm 18.6$	$38.6 \pm 16.6$	$35.2\pm8.0$	$21.7\pm3.2$	$189.7\pm82.7$	$134.5\pm38.6$	$101.7\pm23.0$
2	$42.5\pm16.8$	$30.2\pm14.6$	$33.5\pm7.6$	$16.9\pm1.7$	$195.7\pm88.7$	$151.6\pm43.3$	$109.4\pm24.0$
3	$26.7 \pm 14.9$	$20.3\pm13.2$	$36.1\pm6.9$	$22.1\pm3.6$	$121.4\pm79.6$	$162.1\pm48.8$	$143.5\pm40.9$
4	$31.0\pm13.2$	$22.4 \pm 12.0$	$44.6\pm10.5$	$29.2\pm5.7$	$134.8\pm76.3$	$191.1\pm66.4$	$164.7\pm49.3$
5	$28.6 \pm 11.6$	$20.1\pm10.3$	$32.1\pm5.6$	$16.9\pm3.0$	$125.8\pm63.5$	$136.9\pm36.3$	$112.7\pm31.4$
6	$34.7 \pm 16.0$	$26.7 \pm 14.7$	$44.3\pm10.4$	$23.4\pm4.0$	$125.6\pm68.3$	$160.2\pm48.6$	$152.3\pm47.6$
7	$52.7 \pm 17.9$	$40.0\pm16.3$	$43.3\pm10.7$	$20.8 \pm 1.8$	$259.7\pm105.3$	$211.2\pm63.9$	$128.6\pm24.8$
8	$44.0\pm16.8$	$34.0\pm15.8$	$25.8\pm6.7$	$17.0\pm2.9$	$211.0\pm100.0$	$121.8\pm38.5$	$97.8\pm38.0$
9	$29.6 \pm 14.2$	$20.5\pm12.6$	$28.5\pm5.4$	$14.7\pm2.7$	$96.6\pm61.3$	$93.6\pm27.2$	$71.2\pm25.3$
10	$41.0 \pm 14.8$	$31.2\pm13.8$	$31.3\pm7.3$	$24.2\pm5.7$	$221.9\pm92.4$	$168.0\pm47.9$	$182.5\pm54.8$
$avg \pm std$	$38.0\pm9.1$	$28.4\pm7.6$	$35.5\pm6.7$	$20.7\pm4.4$	$168.2\pm54.1$	$153.1\pm33.8$	$126.4\pm34.2$

#### Table 2.

Average of CBF, CVR, and *v* in CGM. The unit of CBF, CVR, and *v* is ml/min/100g, %CBF/mmHg PetCO<sub>2</sub>, and %, respectively. The baseline CBF was acquired in DGCB, then registered to QSM resolution. BL and HC indicate baseline and hypercapnia, respectively. The HC-CBF was inferred based on the cerebrovascular reactivity (CVR) from DGCB during hypercapnia and PetCO<sub>2</sub> obtained from QSM during hypercapnia, respectively. BL-*v* and HC-*v* maps are shown in Supporting Information Figure S3.

Subject #	BL-CBF DGCB=QQ	CVR	HC-CBF DGCB	HC-CBF QQ	BL-v QQ	HC-v QQ
1	$62.8 \pm 11.9$	4.3	$85.2\pm17.2$	$79.7 \pm 13.6$	$3.0\pm0.5$	$3.3 \pm 0.7$
2	$61.9 \pm 12.0$	7.0	$94.2\pm20.9$	$90.6 \pm 17.8$	$3.0\pm0.5$	$3.5\pm0.7$
3	$55.1 \pm 14.1$	8.0	$78.6\pm20.5$	$83.9\pm20.9$	$3.0\pm0.6$	$3.2\pm0.6$
4	$54.0\pm14.2$	10.0	$79.8\pm21.5$	$74.0\pm17.6$	$2.8\pm0.8$	$2.6\pm0.6$
5	$49.7\pm10.5$	8.9	$76.7\pm18.1$	$79.5 \pm 17.4$	$3.5\pm0.3$	$3.4\pm0.7$
6	$47.2\pm10.1$	9.0	$66.3\pm15.4$	$88.6\pm23.2$	$2.0\pm0.5$	$3.1\pm0.8$
7	$66.5\pm12.5$	5.2	$93.5\pm18.1$	$87.6 \pm 15.4$	$2.1\pm0.5$	$3.7\pm0.6$
8	$59.8 \pm 12.2$	5.6	$82.7 \pm 17.9$	$75.3\pm24.6$	$2.9\pm0.4$	$3.1\pm0.6$
9	$39.0\pm9.8$	8.0	$60.8 \pm 18.1$	$60.6 \pm 17.6$	$3.1\pm0.2$	$2.9\pm0.7$
10	$71.9 \pm 13.4$	7.3	$101.3 \pm 19.9$	$104.7\pm19.9$	$2.9\pm0.4$	$1.9\pm0.4$
$avg \pm std$	$56.8 \pm 9.8$	$7.3\pm1.8$	$81.9\pm12.5$	$82.4 \pm 11.8$	$2.8\pm0.4$	$3.1 \pm 0.5$