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# MR Perfusion to Determine the Status of Collaterals in Patients with Acute Ischemic Stroke: A Look Beyond Time Maps

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## ABSTRACT

**BACKGROUND AND PURPOSE:** Patients with acute stroke with robust collateral flow have better clinical outcomes and may benefit from endovascular treatment throughout an extended time window. Using a multiparametric approach, we aimed to identify MR perfusion parameters that can represent the extent of collaterals, approximating DSA.

**MATERIALS AND METHODS:** Patients with anterior circulation proximal arterial occlusion who had baseline MR perfusion and DSA were evaluated. The volume of arterial tissue delay (ATD) at thresholds of 2–6 seconds ( $ATD^{2-6 \text{ seconds}}$ ) and >6 seconds ( $ATD^{>6 \text{ seconds}}$ ) in addition to corresponding values of normalized CBV and CBF was calculated using VOI analysis. The association of MR perfusion parameters and the status of collaterals on DSA were assessed by multivariate analyses. Receiver operating characteristic analysis was performed.

**RESULTS:** Of 108 patients reviewed, 39 met our inclusion criteria. On DSA, 22/39 (56%) patients had good collaterals. Patients with good collaterals had significantly smaller baseline and final infarct volumes, smaller volumes of severe hypoperfusion ( $ATD^{>6 \text{ seconds}}$ ), larger volumes of moderate hypoperfusion ( $ATD^{2-6 \text{ seconds}}$ ), and higher relative CBF and relative CBV values than patients with insufficient collaterals. Combining the 2 parameters into a Perfusion Collateral Index (volume of  $ATD^{2-6 \text{ seconds}} \times$  relative  $CBV^{2-6 \text{ seconds}}$ ) yielded the highest accuracy for predicting collateral status: At a threshold of 61.7, this index identified 15/17 (88%) patients with insufficient collaterals and 22/22 (100%) patients with good collaterals, for an overall accuracy of 94.1%.

**CONCLUSIONS:** The Perfusion Collateral Index can predict the baseline collateral status with 94% diagnostic accuracy compared with DSA.

**ABBREVIATIONS:** ASITN = American Society of Interventional and Therapeutic Neuroradiology; ATD = arterial tissue delay; PCI = Perfusion Collateral Index; rCBF = relative cerebral blood flow; rCBV = relative cerebral blood volume; ROC = receiver operating characteristic; Tmax = time-to-maximum

In patients with acute ischemic stroke, the status of collateral blood supply can be an independent predictor of reperfusion success and can impact the clinical outcome.<sup>1,2</sup> In addition, promising data suggest that good collateral status can prolong the

time that tissue-at-risk remains salvageable,<sup>3-5</sup> which, in turn, may allow extension of the therapeutic window. Therefore, noninvasive evaluation of the collateral blood supply may be helpful in identifying patients who may benefit from endovascular thrombectomy.

Noninvasive imaging of collateral status can be assessed by direct visualization of the collateral vessels with CTA<sup>6,7</sup> or MRA<sup>8,9</sup> or by the assessment of the efficiency of collateral perfusion with CT perfusion<sup>10,11</sup> or MR perfusion.<sup>12-14</sup> These techniques are complementary: CTA and MRA provide anatomic information about collateral vessels, while perfusion techniques provide functional and circulatory information on leptomeningeal and secondary collateral pathways.<sup>15</sup> Although various perfusion parameters have been used to measure collateral status, specific perfusion criteria to assess collateral status have yet to be defined. Most research has focused on time-based perfusion maps, assuming that patients with good collaterals have less severe delays<sup>12</sup> and larger perfusion delay volumes.<sup>13,16</sup> Some investigators have also looked into using CBV and CBF from raw perfusion data to assess collateral status.<sup>12,17</sup>

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In this study, we hypothesized that MR perfusion time maps, which show only delayed perfusion, are insufficient to predict the status of collaterals if used alone. By applying a multiparametric approach, we aimed to identify perfusion parameters that can represent the extent of collaterals, approximating DSA.

## MATERIALS AND METHODS

### Patients

Patients with anterior circulation acute ischemic stroke who presented within 9 hours of symptom onset and who were considered for revascularization treatment were retrospectively reviewed under an approved institutional review board protocol. Inclusion criteria were the following: 1) large unilateral proximal arterial occlusion (internal carotid or proximal middle cerebral artery), 2) baseline MR imaging including DSC perfusion and DSA, and 3) follow-up imaging to determine the final infarction volume. Patients were excluded if DSC perfusion was nondiagnostic or DSA studies did not allow adequate evaluation of collaterals.

We recorded clinical data, including patient age, sex, baseline NIHSS scores, time from stroke onset, time from onset to groin puncture, and treatment type, including intravenous tissue plasminogen activator (IV tPA) and/or mechanical thrombectomy when available.

### Image Analysis

DWI was acquired using a single-shot spin-echo EPI sequence with following parameters: TR/TE, 4900/98 ms; flip angle, 90°; FOV, 22 × 22 cm; matrix, 128 mm; sections, 30 × 5 mm. Diffusion gradients were applied along 6 noncollinear directions with b-values of 0 and 1000 s/mm<sup>2</sup>, resulting in a 51-second acquisition time. DSC perfusion was performed with a single-shot gradient-echo EPI sequence with the following parameters: TR/TE, 1450/22 ms; flip angle, 90°; FOV, 22 × 22 cm; matrix, 128 mm; sections, 30 × 4 mm. Sixty dynamic frames were obtained during a 90-second acquisition time. A generalized autocalibrating partially parallel acquisition technique with an acceleration factor of 2 was used for both DWI and DSC.

DSC perfusion was processed with US Food and Drug Administration–approved software (Olea Sphere; Olea Medical, La Ciotat, France) by applying a Bayesian probabilistic method.<sup>18</sup> Bayesian is a delay-insensitive probabilistic method in which the Bayes rule is applied to combine experimental perfusion data and a priori information about the parameters, to compute a posteriori probability distribution functions for every parameter of interest. From these distributions, parameter estimates and errors on those estimates can be derived (eg, the mean and SD of the posteriori distributions). Arterial tissue delay (ATD), defined as time-to-maximum of the Bayesian-estimated tissue residue function, CBF, and CBV, was generated. The software used a 6-*df* transformation and a mutual information cost function to coregister DWI and all perfusion maps for each patient. DSC maps were normalized to an ROI placed in normal-appearing white matter in the centrum semiovale, contralateral to the infarct side, to calculate the ratios for CBV and CBF values.

Because ATD is essentially a Bayesian-estimated time-to-maximum (Tmax), previously used time-delay thresholds of 2

and 6 seconds<sup>12,13,19</sup> were used to differentiate brain tissue perfusion properties. ATD > 2 seconds defined any visually perceptible delayed perfusion, and ATD maps with thresholds of 2 and 6 seconds were generated. We applied the following designations: 1) Tissue with ATD > 6 seconds was defined as having severe delayed perfusion; 2) tissue with 2 seconds < ATD ≤ 6 seconds was defined as having moderately delayed perfusion.

Subsequently, a VOI from the above-described ATD maps was calculated using a voxel-based signal intensity threshold method subsuming the entire region of hypoperfusion within the defined threshold. The volume of each VOI and its corresponding relative cerebral blood flow (rCBF) and relative cerebral blood volume (rCBV) were calculated for each patient. Assuming that most blood volume in the moderate hypoperfused tissue is likely via collaterals, we calculated a new perfusion index as the Perfusion Collateral Index (PCI), defined as the volume of moderately hypoperfused tissue (ATD<sup>2–6 seconds</sup>) multiplied by its corresponding mean rCBV (PCI = Volume of ATD<sup>2–6 seconds</sup> × rCBV<sup>2–6 seconds</sup>).

We defined the baseline infarct volume as the volume of tissue with an apparent diffusion coefficient < 600 × 10<sup>-6</sup> mm<sup>2</sup>/s on the baseline MR diffusion images.<sup>20</sup> Final infarct volume was calculated from the follow-up imaging (obtained within 7 days from the initial imaging) using the volume of FLAIR-hyperintense tissue or CT-hypodense tissue.

### DSA Analysis

Angiographic collateral grading was performed with the American Society of Interventional and Therapeutic Neuroradiology (ASITN)/Society of Interventional Radiology Collateral Flow Grading System on baseline angiography (ASITN grades 0–4)<sup>21</sup>: grade 0: no collaterals visible; grade 1: slow collaterals to the periphery of the ischemic site with persistence of some of the defect; grade 2: rapid collaterals to the periphery of the ischemic site with persistence of some of the defect; grade 3: collaterals with slow-but-complete angiographic blood flow of the ischemic bed by the late venous phase; and grade 4: complete and rapid collateral blood flow to the vascular bed in the entire ischemic territory by retrograde perfusion.

Patients were dichotomized to those with good collaterals (ASITN grades 3 and 4) and insufficient collaterals (ASITN grades 0, 1, and 2). Primary revascularization following mechanical thrombectomy was assessed with the TICI scale.<sup>22</sup> Data were dichotomized with TICI ≥ 2b as an indication of successful revascularization.

### Statistical Analysis

Baseline characteristics and neuroimaging variables were compared between subjects with insufficient-versus-good collaterals using the Fisher exact and Wilcoxon rank sum tests as appropriate. For multivariate analysis, a Classification Tree (binary recursive partition) model was used to simultaneously evaluate all (*n* = 12) included imaging (baseline infarction volume, final infarction volume, ATD<sup>>6 seconds</sup>, ATD<sup>2–6 seconds</sup>, rCBF, rCBV, and PCI) and clinical (age, sex, baseline NIHSS score, IV tPA administration, time-to-groin puncture from last known well) parameters of insufficient-versus-good collaterals.

**Table 1: Baseline and clinical data in patients with insufficient-versus-good collateral flow**

Variable	Overall (n = 39)	Good Collaterals (n = 22)	Insufficient Collaterals (n = 17)	P Value
Age (mean) (SD) (yr)	63.3 (13.3)	62.8 (15.3)	63.9 (10.2)	.85
Sex (M/F)	(22:17)	(11:11)	(11:6)	.52
Baseline NIHSS score (median) (IQR)	17, 14–19	16, 13–18	18, 15–20	.19
IV tPA (No.) (%)	18 (46%)	10 (45%)	8 (47%)	.45
Hr to groin puncture from last known well (median) (IQR)	6.10, 5.54–7.14	5.98, 5.67–7.54	6.08, 5.27–7.10	.93
Hr from MRI to groin puncture (median) (IQR) <sup>a</sup>	1.40, 0.80–2.20	1.10, 0.70–1.75	1.5, 0.90–2.14	.58

**Note:**—IQR indicates interquartile range.

<sup>a</sup> Subset analysis (only available for 20 patients, 13 patients with good collaterals and 7 patients with insufficient collaterals).

**Table 2: Imaging data in patients with insufficient-versus-good collateral flow**

Variable	Good Collaterals (n = 22)	Insufficient Collaterals (n = 17)	P Value
Baseline infarct volume (mean) (SD)	29.7 (18.7)	48.3 (30.0)	.021 <sup>a</sup>
Final infarct volume (mean) (SD)	51.1 (32.4)	81.0 (44.7)	.030 <sup>a</sup>
ATD <sup>&gt;6 s</sup> (vol) (mean) (SD)	24.7 (17.4)	42.4 (18.2)	.004 <sup>a</sup>
ATD <sup>2–6 s</sup> (vol) (mean) (SD)	64.6 (25.0)	28.2 (17.1)	<.001 <sup>a</sup>
rCBF <sup>2–6 s</sup> (mean) (SD)	1.16 (0.18)	0.98 (0.25)	.026 <sup>a</sup>
rCBV <sup>2–6 s</sup> (mean) (SD)	1.92 (0.32)	1.17 (0.38)	<.001 <sup>a</sup>
PCI (mean) (SD)	120.70 (47.6)	36.0 (25.8)	<.001 <sup>a</sup>
Primary revascularization (DSA-TICI) (No.) (%) <sup>b</sup>	12 (54.5)	5 (29.4)	.190

**Note:**—vol indicates volume.

<sup>a</sup> Significant.

<sup>b</sup> Primary revascularization based on the outcome of thrombectomy, dichotomized to 0 and 1 using TICI  $\geq$  2b.

Accuracy statistics were computed with a nonparametric receiver operating characteristic (ROC) analysis. Thresholds for separating insufficient from good collaterals were chosen to maximize the unweighted overall accuracy, defined as the weighted average of the percentage of insufficient and good collateral vessels. Sensitivity, specificity, overall accuracy defined as (sensitivity + specificity) / 2, and the area under the ROC curve were reported. The significance level was set at  $P = .05$  in our statistical analysis.

## RESULTS

Among 108 charts reviewed, 39 patients met our inclusion criteria. In 61 patients, baseline DSA was inadequate to provide a score of collateral vessels (lack of an adequate number of phases and injections). Eight patients were excluded due to inadequate and nondiagnostic MR perfusion data. Of those patients included in the analysis, 22 were men, 17 were women (mean age, 63.3 years; range, 37–85 years). The median and interquartile range of the NIHSS scores were 17 and 14–19. Five patients had distal internal carotid occlusion, and 34 patients had proximal MCA occlusion. Twenty-two (56%) patients were classified as having good collaterals defined by ASITN  $\geq$  3 on baseline conventional angiography.

### Clinical Data

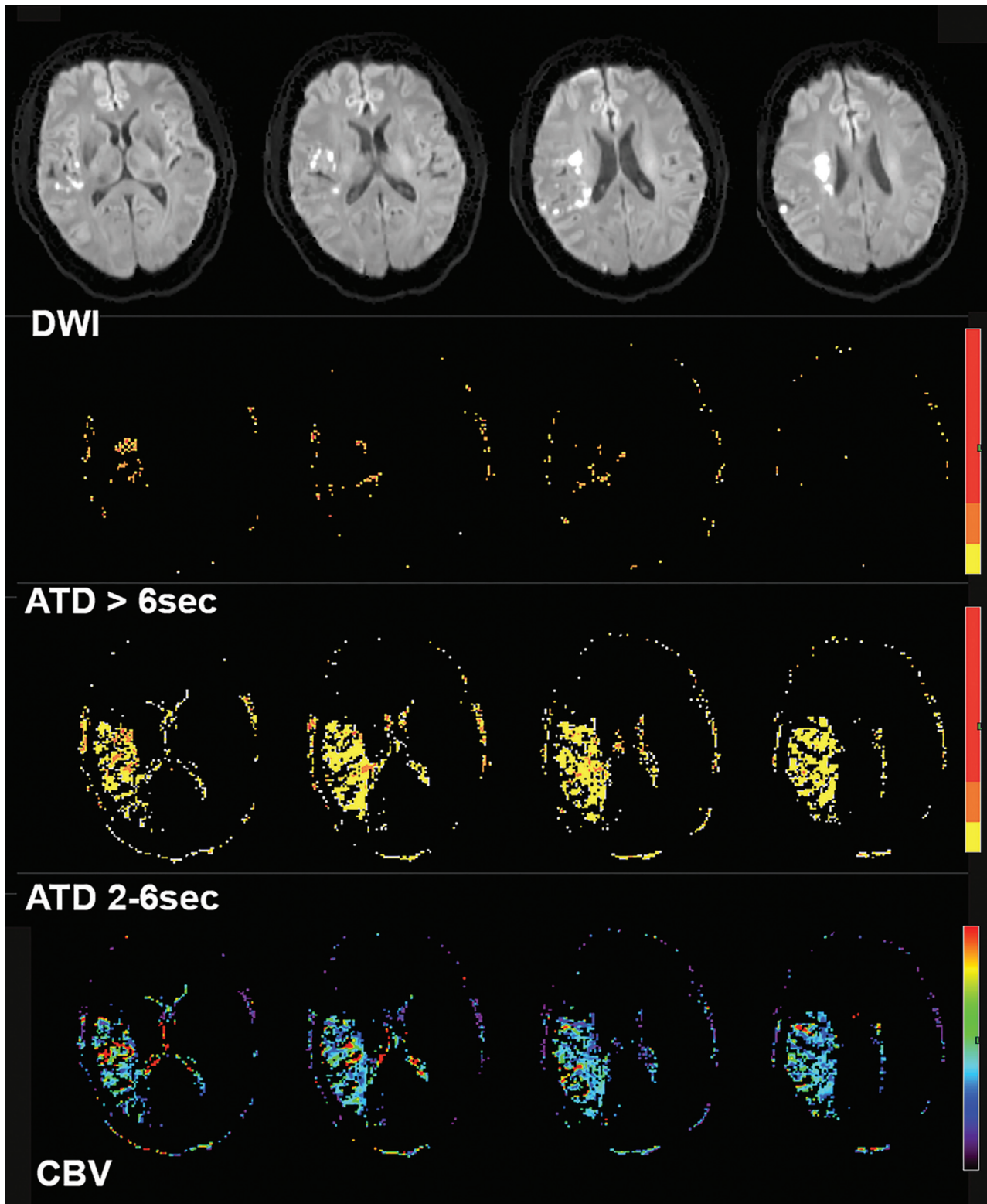
Demographic data and basic clinical information for patients with insufficient-versus-good collaterals are provided in Table 1. Among the 39 patients included, 18 (46%) received IV tPA before undergoing conventional angiography. Administration of IV tPA was not significantly different ( $P = .45$ ) between patients with good (10/22, 45%) versus insufficient collaterals

(8/17, 47%) (Table 1). The time gap between MR imaging and DSA was not significantly different between patients with good collaterals (mean,  $100 \pm 45$  minutes) versus insufficient collaterals (mean,  $128 \pm 39$  minutes). Endovascular treatment was performed with a Merci retriever (Concentric Medical, Mountain View, California) catheter ( $n = 12$ ) or the Penumbra (Penumbra, Alameda, California) suction thrombectomy catheter ( $n = 16$ ) and stent retrieval device ( $n = 11$ ).

### Imaging Data

Univariate analysis showed significantly smaller baseline infarction volume, final infarction volume, and volume of severe (ATD<sup>>6 seconds</sup>) delayed perfusion in patients with good collaterals (Table 2). On the other hand, rCBF, rCBV, PCI, and the volume of moderate (ATD<sup>2–6 seconds</sup>) delayed perfusion were significantly higher in patients with good collaterals (Table 2). The rate of primary postprocedural revascularization did not differ significantly between the 2 groups (Table 2). Figs 1 and 2 show examples of our image analysis in 2 patients with right proximal MCA occlusion; one had good and the other had insufficient collaterals, respectively.

The Classification Tree (binary recursive partition) model in the simultaneous evaluation of all 12 included predictive parameters of insufficient-versus-good collaterals showed that the 2 best single parameters with the highest predictive ability were rCBV<sup>2–6 seconds</sup> and volume of moderate (ATD<sup>2–6 seconds</sup>) hypoperfusion, with an overall diagnostic accuracy of 85% and 82.1%, respectively. Both rCBV<sup>2–6 seconds</sup> (at a threshold of  $>1.6$ ) and volume of ATD<sup>2–6 seconds</sup> (at a threshold of  $>38.28$  mL) could identify 18/22 (81.8%) patients with good collaterals when used alone. A combination of the 2 parameters used in our newly defined Perfusion Collateral Index (Volume of ATD<sup>2–6 seconds</sup>  $\times$  rCBV<sup>2–6 seconds</sup>) resulted in improved predictive accuracy over each measure alone to correctly identify all 22 patients (100%) with good collaterals. Model accuracy statistics, including sensitivity, specificity, overall accuracy, and area under the ROC curve in addition to the optimal threshold for the variables that reached statistical significance, are reported in Table 3. In further analysis of our Classification Tree model, a combination of PCI and baseline infarction volume showed further improvement in predictive accuracy, providing the best tree model with a nominal (not validated) 100% accuracy and ROC area = 1.0 (Fig 3).



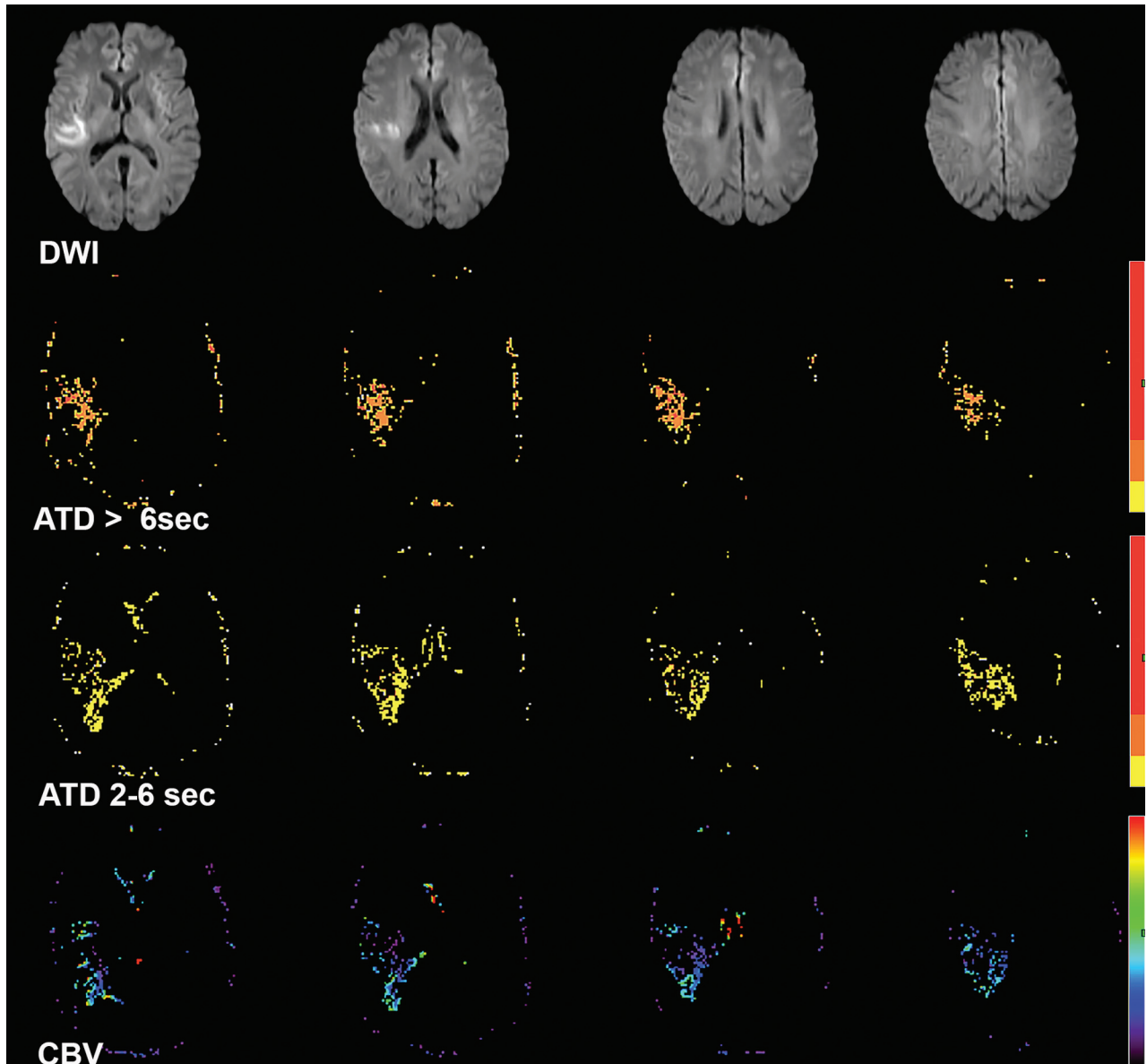
**FIG 1.** A 61-year-old woman with left hemiparesis who had right MCA (M1) occlusion (not shown) but sufficient collaterals on baseline conventional angiography. DWI shows right MCA territorial infarction. Processed perfusion maps show 3.5 mL of severe ( $ATD^{>6 \text{ seconds}}$ ) hypoperfusion, 42 mL of moderate ( $ATD^{2-6 \text{ seconds}}$ ) hypoperfusion, and a mean  $rCBV^{2-6 \text{ seconds}}$  of 1.7 within the hypoperfused area. The Perfusion Collateral Index is  $42 \times 1.7 = 71.4$ .

### DISCUSSION

In this study, we showed that multiparametric MR perfusion enables accurate assessment of collateral status in patients with anterior circulation proximal arterial occlusion who may be candi-

dates for endovascular revascularization. By incorporating rCBV in addition to commonly used perfusion time maps, we defined the Perfusion Collateral Index as a new perfusion parameter superior to other baseline imaging variables to predict the status of





**FIG 2.** A 70-year-old woman with left paresis who had right MCA (M1) occlusion (not shown) and insufficient collaterals on baseline conventional angiography. DWI showed right MCA territorial infarction. Processed perfusion maps show 17 mL of severe ( $ATD^{>6 \text{ seconds}}$ ) hypoperfusion, 20 mL of moderate ( $ATD^{2-6 \text{ seconds}}$ ) hypoperfusion, and a mean  $rCBV^{2-6 \text{ seconds}}$  of 0.9 within the hypoperfused area. The perfusion collateral index is  $20 \times 0.9 = 18$ .

**Table 3: Optimal threshold, sensitivity, specificity, overall accuracy, and ROC area imaging variables that were significant with univariate analysis**

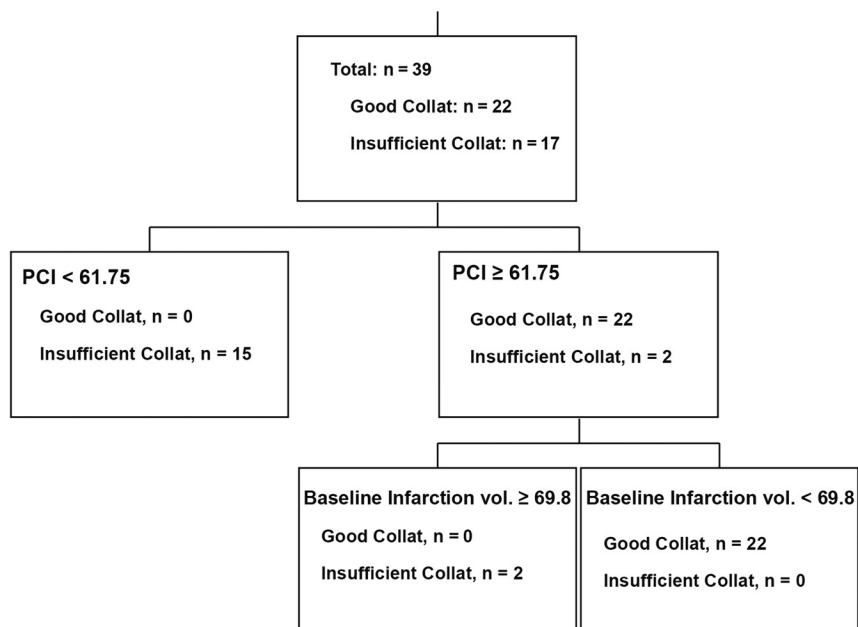
Variable	Threshold	Specificity	Sensitivity	Overall Accuracy	ROC Area
Base infarct volume (mL)	24.1	76.5%	63.6%	70.1%	0.717
Final infarct volume (mL)	45	82.4%	59.1%	70.7%	0.706
Volume of $ATD^{>6 \text{ s}}$ (mL)	27.77	88.2%	63.6%	75.9%	0.777
Volume of $ATD^{2-6 \text{ s}}$ (mL)	38.28	82.4%	81.8%	82.1%	0.906
rCBF	1	58.8%	90.9%	74.9%	0.709
$rCBV^{2-6 \text{ s}}$	1.6	88.2%	81.8%	85.0%	0.900
PCI <sup>a</sup>	61.70	88.2%	100.0%	94.1%	0.973

<sup>a</sup> PCI = Volume of  $ATD^{2-6 \text{ seconds}} \times rCBV^{2-6 \text{ seconds}}$ .

collaterals with a diagnostic accuracy of 94% in comparison with baseline DSA.

There are several studies on the use of MR perfusion for assessing the collateral status in patients with acute ischemic

stroke with predominant focus on the use of perfusion time maps. In 2008, Bang et al<sup>5</sup> showed that patients with good collaterals had a larger volume of mild ( $2 \text{ seconds} \leq T_{\text{max}} < 4 \text{ seconds}$ ) delayed perfusion, but they found no relationship between collateral status and perfusion-diffusion mismatch using  $T_{\text{max}} \geq 4 \text{ seconds}$ . Later, in 2013, Campbell et al<sup>12</sup> showed that better baseline collateral flow measured by digitally subtracted perfusion MR imaging was associated with a larger diffusion-perfusion mismatch using  $T_{\text{max}} > 6 \text{ seconds}$ . In 2014, good collateral status was shown to be associated with a smaller volume of severe hypoperfusion using



**FIG 3.** The Classification Tree model using a combination of the PCI (Volume of  $ATD^{2-6 \text{ seconds}} \times rCBV^{2-6 \text{ seconds}}$ ) and baseline infarction volume provides a nominal (not validated) 100% accuracy and ROC area = 1.0.

$T_{max} \geq 6 \text{ seconds}$ <sup>13</sup> and  $ATD \geq 6 \text{ seconds}$ .<sup>19</sup> Later, Olivot et al<sup>23</sup> showed that a smaller hypoperfusion intensity ratio (defined as the proportion of  $T_{max} > 6$ -second lesion volume with a  $T_{max} > 10$ -second delay) was associated with good collateral status. Most interesting, in 2015, by applying a probabilistic method, Lee et al<sup>14</sup> showed that good collaterals were associated with more severe delayed perfusion with a  $T_{max}$  of 16–22 seconds.

In our study, in addition to commonly used perfusion time maps, we incorporated additional information obtained via rCBV to improve our prediction of collateral status. The hallmarks of collateral perfusion are delay and dispersion.<sup>24</sup> Perfusion deficits noted on MR perfusion time maps (such as  $T_{max}$ ) encompass both delayed perfusion due to underlying arterial occlusion and delayed flow via collateral circulation. The addition of CBV to routinely used time maps may provide information regarding the amount of blood flow to the ischemic region of the brain (dispersion component); although the arterial source of sustained perfusion may not be evident, in the presence of large arterial occlusion, most of it will be from the collateral circulation.

We showed that in the presence of proximal arterial occlusion, rCBV provides essential information about the status of collaterals and is insightful concerning the distribution and dispersion of collateral flow, a component that may be overlooked using perfusion time maps alone. We showed that mean rCBV values calculated from the region with moderate hypoperfusion have an overall diagnostic performance (85%) similar to that of the volume of  $ATD^{2-6 \text{ seconds}}$  (82.1%) for predicting good baseline collaterals. However, when used in combination with our newly defined PCI (Volume of  $ATD^{2-6 \text{ seconds}} \times rCBV^{2-6 \text{ seconds}}$ ), it further improved the overall diagnostic performance to 94.1%. This translated into identifying 4 additional (20%) patients

with good collaterals who were falsely categorized by rCBV or a volume of  $ATD^{2-6 \text{ seconds}}$  alone.

Our results also showed that a larger volume of moderate ( $ATD^{2-6 \text{ seconds}}$ ) hypoperfusion is a better indicator of good baseline collateral status, with higher specificity (81.8%) compared with a smaller volume of severe ( $ATD^{>6 \text{ seconds}}$ ) hypoperfusion (specificity of 63.6%). This finding is interesting and somewhat different from prior reports in which a better association between good collateral status and a smaller volume of severe hypoperfusion has been shown using  $T_{max} > 6 \text{ seconds}$ .<sup>12,13,23</sup> This may be explained by intrinsic technical differences between Bayesian-estimated ATD and singular value decomposition-estimated  $T_{max}$ .

To increase the broad acceptance of perfusion imaging in the stroke neurology community, further improve-

ment of methodology in image postprocessing is required, especially when dealing with a noisy imaging environment such as DSC perfusion. In this study, we used ATD rather than  $T_{max}$  to take advantage of inherent noise-resistance behavior of the Bayesian postprocessing. Although Bayesian-derived ATD is equivalent to deconvolution-derived  $T_{max}$  in terms of definition (maximum time-to-peak of the residue function), they do not share the same properties. The Bayesian method is a robust probabilistic method that minimizes effects of oscillation, tracer delay, and low SNR during residue function estimation compared with other deconvolution methods.<sup>18,25</sup> The inherent delay insensitivity of the Bayesian technique is essential for accurate evaluation of the perfusion time delay to minimize the effect of existing underlying arterial occlusion.<sup>26</sup> In addition, simulation studies in agreement with the recommendations from the Acute Stroke Research Imaging Roadmap II<sup>27</sup> have shown highly reproducible and accurate data for ATD estimation.<sup>18</sup> A follow-up study between ATD and  $T_{max}$ -estimated PCI may be helpful for exploring potential differences between these techniques.

Our study has several limitations. First, we acknowledge potential selection bias associated with retrospective studies. Second, our small sample size may affect some part of our results. For example, we showed that patients with good baseline collaterals tend to have a higher recanalization rate, but this trend was not statistically significant ( $P = .19$ ), which may have been a function of the small sample size. In our Classification Tree model, combining PCI and baseline infarct volume yielded a nominal accuracy of 100% (Fig 3). However, this result must be interpreted in the context of our small sample, and like any predictive model, our results need to be validated in a large prospective cohort. Finally, we excluded 61 patients due to inadequate DSA data for collateral scoring. This is an inevitable challenge in acute ischemic

stroke because performing a complete diagnostic angiography for collateral assessment poses a delay in treatment. This further highlights the need for development of an advanced noninvasive collateral grading system such as ours from which accurate collateral status may be imputed. To establish the accuracy of our perfusion parameters, we had to compare our results with the current standard of reference (DSA). It is, however, plausible that perfusion imaging may outperform rough collateral grading obtained from 2D DSA as shown by prior reports.<sup>12</sup>

## CONCLUSIONS

Using a multiparametric MR imaging approach, we identified the Perfusion Collateral Index, defined as  $\text{Volume of ATD}^{2-6 \text{ seconds}} \times \text{rCBV}^{2-6 \text{ seconds}}$ , as a new perfusion parameter that provides accurate noninvasive estimation of baseline collateral status with a diagnostic accuracy of 94% compared with DSA. If its potential is realized, the PCI can be used to accurately identify patients with good collaterals, potentially extending the treatment window and increasing the number of patients who may benefit from endovascular treatment in the current era of endovascular therapy.

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