



# Application of deep learning image reconstruction-high algorithm in one-stop coronary and carotid-cerebrovascular CT angiography with low radiation and contrast doses

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**Background:** For patients with suspected simultaneous coronary and cerebrovascular atherosclerosis, conventional single-site computed tomography angiography (CTA) for both sites can result in nonnegligible radiation and contrast agent dose. The purpose of this study was to validate the feasibility of one-stop coronary and carotid-cerebrovascular CTA (C&CC-CTA) with a “double-low” (low radiation and contrast) dose protocol reconstructed with deep learning image reconstruction with high setting (DLIR-H) algorithm.

**Methods:** From February 2018 to January 2019, 60 patients referred to C&CC-CTA simultaneously in West China Hospital were recruited in this prospective cohort study. By random assignment, patients were divided into two groups: double-low dose group (n=30) used 80 kVp and 24 mgI/kg/s contrast dose with images reconstructed using DLIR-H; and routine-dose group (n=30) used 100 kVp and 32 mgI/kg/s contrast dose with images reconstructed using 50% adaptive statistical iterative reconstruction-V (ASIR-V50%). Radiation and contrast doses, subjective image quality score, CT attenuation values, noise, signal-to-noise ratio (SNR) and contrast-to-noise ratio (CNR) were measured and compared between the groups.

**Results:** The DLIR-H group used 30% less contrast dose (35.80±4.85 vs. 51.13±6.91 mL) and 48% less overall radiation dose (1.00±0.09 vs. 1.91±0.42 mSv) than the ASIR-V50% group (both P<0.001). There was no statistically significant difference on subjective quality score between the two groups (C-CTA: 4.38±0.67 vs. 4.17±0.81, P=0.337 and CC-CTA: 4.18±0.87 vs. 4.08±0.79, P=0.604). For coronary CTA, lower background noise (18.93±1.43 vs. 22.86±3.75 HU) was reached in DLIR-H group, and SNR and CNR at all assessed branches were significantly increased compared to ASIR-V50% group (all P<0.05), except SNR of left anterior descending (P>0.05). For carotid-cerebrovascular CTA, DLIR-H group was comparable in background noise (19.25±1.42 vs. 20.23±2.40 HU), SNR and CNR at all assessed branches with ASIR-V50% group (all P>0.05).

**Conclusions:** The “double-low” dose one-stop C&CC-CTA with DLIR-H obtained higher image quality compared with the routine-dose protocol with ASIR-V50% while achieving 48% and 30% reduction in radiation and contrast dose, respectively.

**Keywords:** Coronary artery disease (CAD); stroke; computed tomography angiography (CTA); image quality

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## Introduction

Atherosclerosis has been widely considered as one of the leading causes of mortality worldwide, involving multiple sites including coronary, cerebrovascular, and peripheral arteries. Evidence has been collected to show that coronary and cerebrovascular atherosclerosis often happen simultaneously, due to their similar underlying pathophysiology and shared cardiovascular risk factors (1-5). Co-existed coronary and cerebrovascular atherosclerosis have been proved to increase the risk of major vascular events compared to either coronary or cerebrovascular atherosclerosis alone. Stroke patients with asymptomatic coronary artery disease (CAD) have greater risks of future major vascular events than those without (6,7). Carotid atherosclerosis can be an independent predicting factor for major adverse cardiac events in CAD patients(8). Therefore, choosing appropriate image modality to identify patients with co-existing coronary and cerebral-carotid atherosclerosis possesses great clinical significance.

Computed tomography angiography (CTA) is the recommended tool for screening, diagnosing, and evaluating atherosclerosis diseases. Besides its non-invasive and time-saving properties, CTA is capable of precisely describing the anatomies of arteries and exhibits high sensitivity in the screening for CAD (9-11). Nevertheless, conventional CTA scan protocol was designed for separately imaging coronary or carotid-cerebrovascular arteries, resulting in an attendant increase in radiation and contrast agent doses. Repeated examination for different sites will also increase the treatment expense. Recently, one-stop coronary and carotid-cerebrovascular CTA (C&CC-CTA) protocol using iterative reconstruction (IR) algorithm has been introduced and provides a potential clinically feasible examination for patients suspected with co-existing atherosclerosis disease (12-17). However, previously published one-stop C&CC-CTA protocols still presented with slightly high image noise, and the radiation and contrast dose are expected to be further reduced.

The introduction of deep learning image reconstruction (DLIR) algorithm, incorporating a convolutional neural network, has brought new hope for decreasing image noise, and thus optimizing image quality with a more balanced spatial resolution for CTA (18,19). DLIR provides three

selectable strength levels (low, medium and high), and DLIR-high (DLIR-H) has been proved to gain the highest ability for reducing image noise while maintaining spatial resolution of images reasonably well (20-22). In our recent study, compared with an adaptive statistical iterative reconstruction-V (ASIR-V) based protocol, the combination of DLIR-H algorithm and low tube voltage for coronary CTA demonstrated superiority in achieving higher image quality as well as significantly lower radiation and contrast dose (23). Furthermore, our preliminary study revealed that under the same scanning condition, DLIR-H presented significantly better image quality than ASIR-V at a strength level of 50% (ASIR-V50%) for one-stop C&CC-CTA (Table S1). To our knowledge, the effect of DLIR-H on one-stop C&CC-CTA has not been investigated elsewhere.

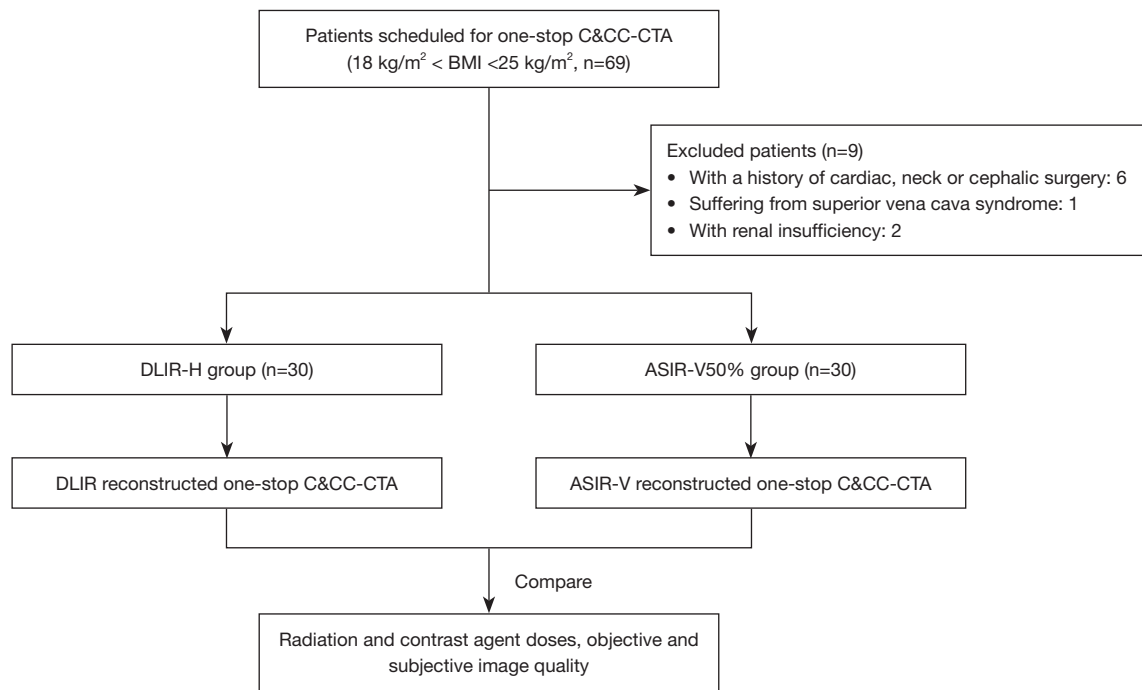
The aim of this study was to validate the feasibility of one-stop C&CC-CTA using DLIR-H algorithm with 256-slice CT and explore its capacity in reducing radiation and contrast agent dose. We present this article in accordance with the STROBE reporting checklist (available at <https://qims.amegroups.com/article/view/10.21037/qims-23-864/rc>).

## Methods

### Study population

This prospective cohort study was conducted in accordance with the Declaration of Helsinki (as revised in 2013). The study was approved by the Ethics Committee of West China Hospital. All participants provided written informed consents.

From February 2018 to January 2019, adult patients, with body mass index (BMI) within 18–25 kg/m<sup>2</sup>, who were referred to both C&CC-CTA in West China Hospital were initially recruited for this study. Exclusion criteria were then applied including patients who (I) had a history of cardiac, neck or cephalic surgery, (II) suffered superior vena cava syndrome, or (III) had contraindications to contrast-enhanced CT examinations (e.g., renal insufficiency, allergic to contrast medium). The enrolled patients were randomly divided into the DLIR-H group and the ASIR-V50% group (Figure 1). Demographic data (age, gender), height, weight,



**Figure 1** Flowchart of the study design. DLIR-H, deep learning image reconstruction-high; ASIR-V50%, 50% adaptive statistical iterative reconstruction-V; BMI, body mass index; C&CC-CTA, coronary and carotid-cerebrovascular CTA. CTA, computed tomography angiography.

heart rate, vascular risk factors and reasons for one-stop CTA were collected once the patient was included in the study.

### **Image acquisition and reconstruction**

All participants underwent CTA scanning with a 256-row CT scanner (Revolution CT, GE HealthCare, Milwaukee, USA) with their arms raised at the sides of the head. Patients in both groups underwent the non-contrast CT first. After the contrast injection, all patients underwent a coronary CTA with prospective electrocardiogram gating, followed by carotid-cerebrovascular scanning after a delay of 1.5 s. Following published articles, the coronary CTA scanning used 80 kVp and smart mA for noise index (NI) of 36 for the DLIR-H group, and 100 kVp and smart mA for NI of 25 for the ASIR-V50% group (23-26). In both groups, the coronary CTA was acquired within one heartbeat triggered using the automatic gating technique, with the best systolic and diastolic phases recommended by the device and snapshot freeze cardiac motion correction technique activated: for patients with a heart rate (HR) <66 bpm, images were collected at the 70–80% of the R-R

cardiac interval. For patients with a HR between 66 and 85 bpm, images were collected at both 40–55% and 70–80% of the R-R interval. As for those with a HR >85 bpm, images were collected at the 40–60% of the R-R interval. The carotid-cerebrovascular image acquisition parameters were set to be 80 kVp and 500 mA for the DLIR-H group, and 100 kVp and 450 mA for the ASIR-V50% group.

The non-ionized contrast agent (Iopamidol, concentration 370 mgI/mL) was intravenously injected through the antecubital vein using a double-syringe power injector. A reduced weight-dependent contrast dose rate of 24 mgI/kg/s was set for the DLIR-H group, while a conventional weight-dependent contrast dose rate of 32 mgI/kg/s was set for the ASIR-V50% group. The injection was finished in 10 s for each participant. Following contrast injection, 30 mL of saline was injected with a same injection rate for both groups. Bolus-tracking technique was applied to control the contrast agent injection timing, with a monitoring region of interest (ROI) placed in the root of ascending aorta for triggering at the threshold of 200 HU. The coronary CTA started with a delay time of 3.1 s after triggering.

All images were reconstructed with a standard kernel

at 0.625 mm section thickness. DLIR-H algorithm and ASIR-V50% algorithm were used for image reconstruction for the DLIR-H group and ASIR-V50% group, respectively. The axial images were transferred to an advanced workstation (AW4.7, GE Healthcare) for the 3D post-processing reconstruction to generate maximum intensity projection, curved planar reformat, and volume rendering images for the subjective evaluation of image quality.

### Image quality analysis

The coronary arteries were divided into 18 segments according to the American Heart Association standard for analysis (27). Segments with coronary artery diameter  $\geq 1.5$  mm were evaluated. The carotid and cerebral arteries were divided into 19 segments according to previous studies (28). Segments with carotid and cerebral artery diameter  $\geq 2$  mm were evaluated. Image quality was analyzed by two independent radiologists (both with medical degree with 6 and 15 years of imaging experience). A 5-point grading system was used to grade the vessel enhancement, image noise and artifact: (I) score 1 for poor vessel enhancement, inadequate delineation between the vessel and its surrounding tissue, severe image noise and artifact; (II) score 2 for suboptimal vessel enhancement and blurring of vessel margin, substantial image noise and obvious artifact; (III) score 3 for acceptable vessel enhancement, moderate blurring of vessel margin, and moderate image noise and artifact; (IV) score 4 for good vessel enhancement, slightly blurring of vessel margin and mild image noise and artifact; (V) score 5 for excellent vessel enhancement, clear vessel margin, very low image noise and negligible artifact.

For the objective analysis of coronary artery images, three ROIs were placed at the origin of right coronary artery (RCA), left anterior descending artery (LAD) and left circumflex artery (LCX) to measure the mean CT value ( $CT_{\text{vessel}}$ ) as the attenuation of vessels and standard deviation ( $SD_{\text{vessel}}$ ). Another ROI was placed on the fat of adjacent chest wall to measure the CT attenuation value ( $CT_{\text{fat}}$ ) and standard deviation ( $SD_{\text{fat}}$ ) of fat. For carotid-cerebrovascular images,  $CT_{\text{vessel}}$  and  $SD_{\text{vessel}}$  were measured by placing three ROIs at the median thyroid level for common carotid artery (CCA), internal carotid artery (ICA) and middle cerebral artery (MCA). Then background ROIs were drawn at the lateral muscles at the corresponding level to acquire attenuation ( $CT_{\text{muscle}}$ ) and standard deviation ( $SD_{\text{muscle}}$ ) of muscles. Signal-to-noise ratio (SNR) for vessels

was calculated as  $CT_{\text{vessel}}/SD_{\text{vessel}}$ , and contrast-to-noise ratio (CNR) was defined as  $(CT_{\text{vessel}} - CT_{\text{muscle}}) / SD_{\text{muscle}}$ .

### Radiation dose and contrast agent

Volume CT dose index (CTDIvol) and dose length product (DLP) for each patient were recorded. Effective dose (ED) was calculated according to the following formula:  $ED = DLP \times k$ . The  $k$  values vary along with the regions of the scanned body (for coronary imaging,  $k=0.014 \text{ mSv}\cdot\text{mGy}^{-1}\cdot\text{cm}^{-1}$ ; for carotid-cerebrovascular imaging,  $k=0.0040 \text{ mSv}\cdot\text{mGy}^{-1}\cdot\text{cm}^{-1}$ ) (29,30). Contrast agent volume and flow rate were also recorded by the operators.

### Statistical analysis

All statistical analyses were performed with the R program (v. 4.1.0, R Foundation for Statistical Computing; <https://www.r-project.org/>). The sample size was defined by referring to a previous study performed at our institution, with similar research design, methodology and hypotheses (23). Nevertheless, a dedicated power analysis to determine the sample size was not performed. Continuous data were expressed as mean  $\pm$  SD. Data distribution normality was tested using the Shapiro-Wilk test. The independent two-tailed  $t$ -test and Mann-Whitney  $U$ -test were employed to compare quantitative variables. Categorical data were expressed as frequency and the corresponding percentage. Chi-squared test was employed to make comparison of categorical data. Kappa statistics were used to compare interobserver agreement (kappa value over 0.7 was defined as excellent agreement, 0.4–0.7 as good agreement, and less than 0.4 as bad agreement) (23). A P value below 0.05 was considered to indicate statistical significance.

## Results

### Patient characteristics

During the study period, 69 patients were eligible for inclusion. Nine patients were excluded for the following reasons: with a history of cardiac, neck or cephalic surgery ( $n=6$ ), suffering from superior vena cava syndrome ( $n=1$ ), with renal insufficiency ( $n=2$ ). The remaining 60 patients were randomly divided into the DLIR-H group ( $n=30$ , male/female, 23/7) and the ASIR-V50% group ( $n=30$ , male/female, 25/5). A flowchart briefly describing the patient selection is shown in *Figure 1*.

**Table 1** Demographic and basic data of patients

Characteristic	DLIR-H group (n=30)	ASIR-V50% group (n=30)	t/ $\chi^2$	P
Age, years	56.77±13.31	54.77±12.41	0.60	0.55
Gender, female/male	7/23	5/25	0.42	0.52
Basic clinical and CT data				
BMI, kg/m <sup>2</sup>	21.96±1.99	22.51±2.01	-1.06	0.29
Heart rate, bpm	72.87±13.46	73.97±12.43	-0.33	0.74
Arrythmia	4 (13.33)	3 (10.00)	0.16	0.69
Vascular risk factor				
Hypertension	19 (63.33)	17 (56.67)	0.28	0.60
Dyslipidemia	13 (43.44)	11 (36.67)	0.28	0.60
Type II diabetes	9 (30.00)	7 (23.33)	0.34	0.56
Family history of CAD	13 (43.44)	15 (50.00)	0.27	0.61
Smoking	12 (40.00)	15 (50.00)	0.61	0.44
Reasons referred to one-stop CTA				
Stroke	15 (50.00)	11 (36.67)	1.09	0.30
TIA	6 (20.00)	7 (23.33)	0.10	0.75
CAD	7 (23.33)	9 (30.00)	0.34	0.56
AAA	2 (6.67)	3 (10.00)	0.22	0.64

Parametric continuous data are expressed as means  $\pm$  standard deviation with t value. Category data are expressed as numbers with percentages in parentheses, with  $\chi^2$ . DLIR-H, deep learning image reconstruction-high; ASIR-V50%, 50% adaptive statistical iterative reconstruction-V; BMI, body mass index; bpm, beat per minute; CAD, coronary artery disease; CTA, computed tomography angiography; TIA, transient ischemic attack; AAA, abdominal aortic aneurysm.

Characteristics of the participants are summarized in *Table 1*. There were 15 cases of stroke, 6 cases of transient ischemic attack (TIA), 7 cases of CAD and 2 cases of abdominal aortic aneurysm (AAA) in the DLIR-H group, while 11 cases of stroke, 7 cases of TIA, 9 cases of CAD and 3 cases of AAA in the ASIR-V50% group (all  $P > 0.05$ ). No statistically significant difference was observed in sex, age, BMI, HR, and vascular risk factors between the two groups.

### Radiation dose and contrast agent

The overall CTDI<sub>vol</sub> and DLP values for the DLIR-H group were statistically lower than that for the ASIR-V50% group (5.55±0.39 *vs.* 10.29±1.75 mGy in CTDI<sub>vol</sub>,  $P < 0.001$  and 158.26±10.26 *vs.* 293.97±34.14 mGy·cm in DLP,  $P < 0.001$ ). The ED was 1.00±0.09 mSv for the DLIR-H Group, and 48% lower than the 1.91±0.42 mSv for the ASIR-V50% Group ( $P < 0.001$ ). Furthermore, when considering the radiation dose of separate coronary or

cerebrovascular scanning, the DLP and ED of DLIR-H group were all significantly lower than those of ASIR-V50% group (C-CTA: 36.27±6.05 *vs.* 73.25±29.21 mGy·cm in DLP,  $P < 0.001$  and 0.51±0.08 *vs.* 1.03±0.41 mSv in ED,  $P < 0.001$ ; CC-CTA: 121.99±8.03 *vs.* 220.72±15.21 mGy·cm in DLP,  $P < 0.001$  and 0.49±0.03 *vs.* 0.88±0.06 mSv in ED,  $P < 0.001$ ). The contrast agent volume was 35.80±4.85 mL for the DLIR-H group, 30% lower than the 51.13±6.91 mL for the ASIR-V50% group ( $P < 0.001$ ). The contrast flow rate of the DLIR-H group was also significantly lower than that of the ASIR-V50% group (3.58±0.49 *vs.* 5.09±0.65 mL/s,  $P < 0.001$ ). The CTDI<sub>vol</sub>, DLP, and ED values for C-CTA and CC-CTA are listed separately in *Table 2*.

### Image quality

#### Subjective analysis

##### Coronary artery

The distribution of the subjective quality scores is listed

**Table 2** Comparison of radiation dose and contrast agent dose between two groups

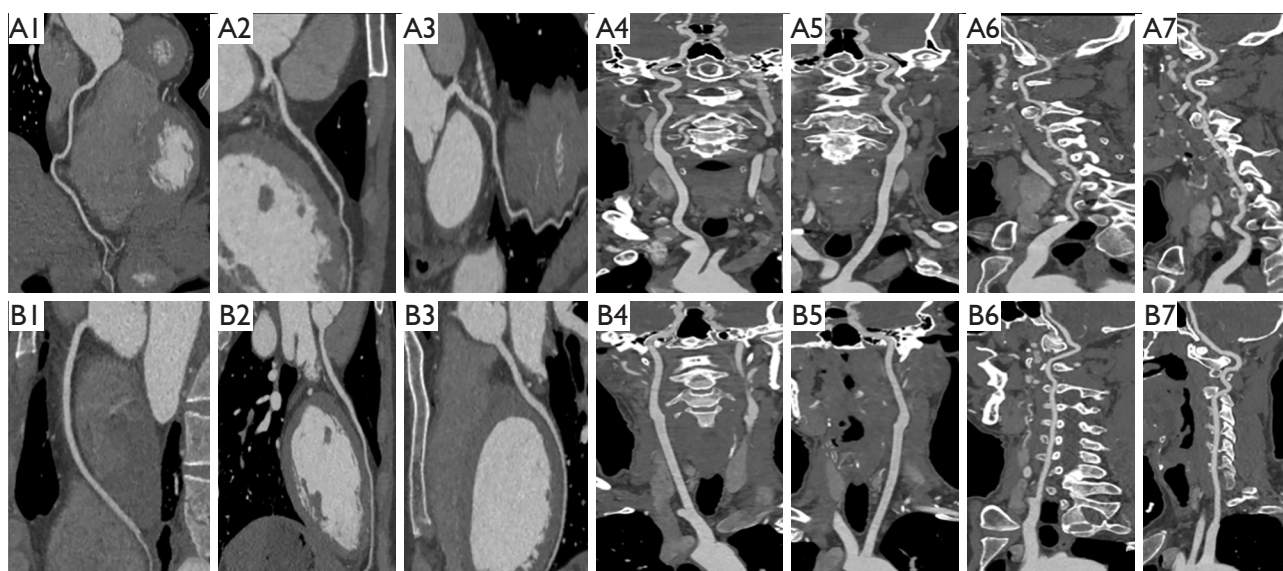
Parameter	DLIR-H group (n=30)	ASIR-V50% group (n=30)	t value	P
Radiation dose				
Coronary CTA				
CTDIvol, mGy	2.49±0.39	4.88±1.75	-7.32	<0.001
DLP, mGy·cm	36.27±6.05	73.25±29.21	-6.79	<0.001
ED, mSv	0.51±0.08	1.03±0.41	-6.77	<0.001
Carotid-cerebrovascular CTA				
CTDIvol, mGy	3.06	5.41	NA	NA
DLP, mGy·cm	121.99±8.03	220.72±15.21	-31.43	<0.001
ED, mSv	0.49±0.03	0.88±0.06	-31.44	<0.001
Overall				
CTDIvol, mGy	5.55±0.39	10.29±1.75	-14.51	<0.001
DLP, mGy·cm	158.26±10.26	293.97±34.14	-20.85	<0.001
ED, mSv	1.00±0.09	1.91±0.42	-11.61	<0.001
Contrast agent dose				
Contrast doses, mL	35.80±4.85	51.13±6.91	-9.94	<0.001
Contrast flow rate, mL/s	3.58±0.49	5.09±0.65	-10.18	<0.001

Parametric continuous data are expressed as means ± standard deviation with t value. DLIR-H, deep learning image reconstruction-high; ASIR-V50%, 50% adaptive statistical iterative reconstruction-V; CTA, computed tomography angiography; CTDIvol, volume CT dose index; DLP, dose length product; ED, effective dose; NA, not applicable.

**Table 3** Subjective image quality (distribution) comparison between two groups

Quality score	DLIR-H group (n=30)		ASIR-V50% group (n=30)	
	Reader 1	Reader2	Reader 1	Reader 2
Coronary CTA				
1	0	0	0	0
2	0	0	0	0
3	3	4	8	9
4	12	11	8	8
5	15	15	14	13
Carotid-cerebrovascular CTA				
1	0	0	0	0
2	0	0	0	0
3	9	9	8	9
4	6	7	11	10
5	15	14	11	11

DLIR-H, deep learning image reconstruction-high; ASIR-V50%, 50% adaptive statistical iterative reconstruction-V; CTA, computed tomography angiography.



**Figure 2** Image quality comparison between the two groups. (A1-A7) Case in the double-low dose group. Male, 56 years old, scanned with the 80-kVp one-stop C&CC-CTA protocol and reconstructed using DLIR-H algorithm. (B1-B7) Case in the routine-dose group. Male, 54 years old, scanned with the 100-kVp one-stop C&CC-CTA protocol with ASIR-V50% algorithm. Both patients showed the image quality reached a subjective score of 5 with clear border of blood vessel. C&CC-CTA, coronary and carotid-cerebrovascular CTA; DLIR-H, deep learning image reconstruction-high; ASIR-V50%, 50% adaptive statistical iterative reconstruction-V; CTA, computed tomography angiography.

in *Table 3*. All scores for both groups exceeded 3, meeting the diagnostic requirement. The mean score was slightly higher in the DLIR-H group compared with that in the ASIR-V50% group ( $4.38 \pm 0.67$  vs.  $4.17 \pm 0.81$ ); however, the difference was not statistically significant ( $P=0.337$ ). The kappa analysis indicated a good consistency in image quality evaluation between the two readers with kappa value of 0.656.

#### **Carotid and cerebral artery**

The distribution of subjective quality scores for carotid and cerebral arteries is also listed in *Table 3*. Diagnostic requirement was validated in both groups as all scores exceeded 3. There was no statistically significant difference in mean score between the DLIR-H group and ASIR-V50% group ( $4.18 \pm 0.87$  vs.  $4.08 \pm 0.79$ ,  $P=0.604$ ). The kappa analysis indicated a good consistency in image quality evaluation between the two readers with kappa value of 0.796. *Figure 2* reveals an example of the good image quality using the DLIR-H scan protocol for normal patients. *Figure 3* exhibits the capacity of the DLIR-H scan protocol in detecting mixed and calcified plaques of coronary and cerebral arteries.

#### **Objective analysis**

##### **Coronary artery**

At all three branches assessed, there was no statistical

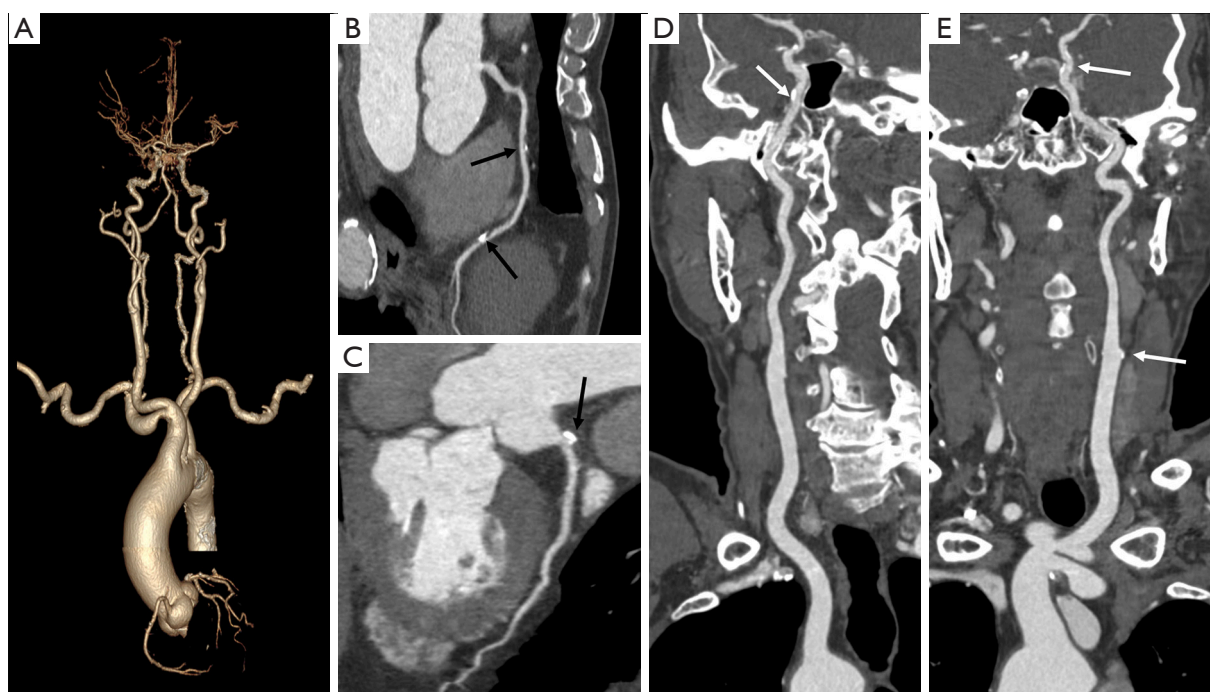
difference in CT attenuation value between the DLIR-H and ASIR-V50% group (all  $P>0.05$ ). Nevertheless, image noise in the DLIR-H group was significantly reduced compared with that of ASIR-V50% group ( $P<0.001$ ), resulted in statistically higher CNR for all vessels in the DLIR-H group compared to the ASIR-V50% group (details in *Table 4*). Besides, in the DLIR-H group, SNR of RCA and LCX were significantly higher, compared with the ASIR-V50% group ( $P=0.001$ , and  $P=0.032$ ). And SNR of LAD was slightly higher in the DLIR-H group, while the difference was not statistically significant ( $P=0.301$ ) (*Table 4* and *Figure 4*).

##### **Carotid and cerebral vascular**

The CT attenuation value, SNR and CNR of all arteries comparable within the two groups (all  $P>0.05$ ). The DLIR-H group possessed significantly lower noise for the CCA level than the ASIR-V50% group ( $20.49 \pm 2.88$  vs.  $23.06 \pm 3.90$  HU,  $P=0.005$ ), while for the ICA level, MCA level, and the average of the three levels, no statistical differences were reached between the two groups (all  $P>0.05$ ) (*Table 5* and *Figure 4*).

#### **Discussion**

Our low-contrast and radiation dose one-stop C&CC-CTA



**Figure 3** Plaque detection by DLIR scan protocol. A 76-year-old male with palpitation for three months was referred to coronary CTA and cerebral-carotid CTA, 80-kvp one-stop C&CC-CTA using DLIR-H was applied. The patient was suspected with renal insufficiency by his physician, therefore a further decreased contrast agent volume of 36 mL was injected. (A) The volume rendering technique exhibited good image quality of cerebral, carotid and coronary arteries. Mixed plaques with mild stenosis (black arrows) were detected in the mid and distal segment of the RCA (B), proximal segment of the left main branch (C). Calcified plaques and mild stenosis (white arrows) were recognized at multiple sites for right internal carotid artery (D) and left internal carotid artery (E). DLIR-H, deep learning image reconstruction-high; C&CC-CTA, coronary and carotid-cerebrovascular CTA; RCA, right coronary artery; CTA, computed tomography angiography.

protocol with DLIR-H achieved at least non-inferior image quality but significantly reduced contrast and radiation doses compared to the IR-based routine-dose one-stop protocol. Image quality improvement was demonstrated predominantly in coronary arteries, where the vessel enhancement was significantly improved, and image noise was reduced by 17.2% to 18.93 HU. As for the carotid and cerebrovascular section, our protocol exhibited comparable image quality compared with the routine-dose ASIR-V50% group. The DLIR-H algorithm again showed stable ability in reducing image noise and retaining image quality at low radiation and contrast doses. Clinical application of DLIR-H algorithm might achieve contrast and radiation “double” saving CTA protocol. Therefore, further studies on validating its impact on clinical diagnosis work-up are warranted.

DLIR has been applied to a wide range of CTA protocols like chest, abdominal and vascular diseases, exhibiting 13.6–37.6% reduction in image noise (19,31–33). Our study

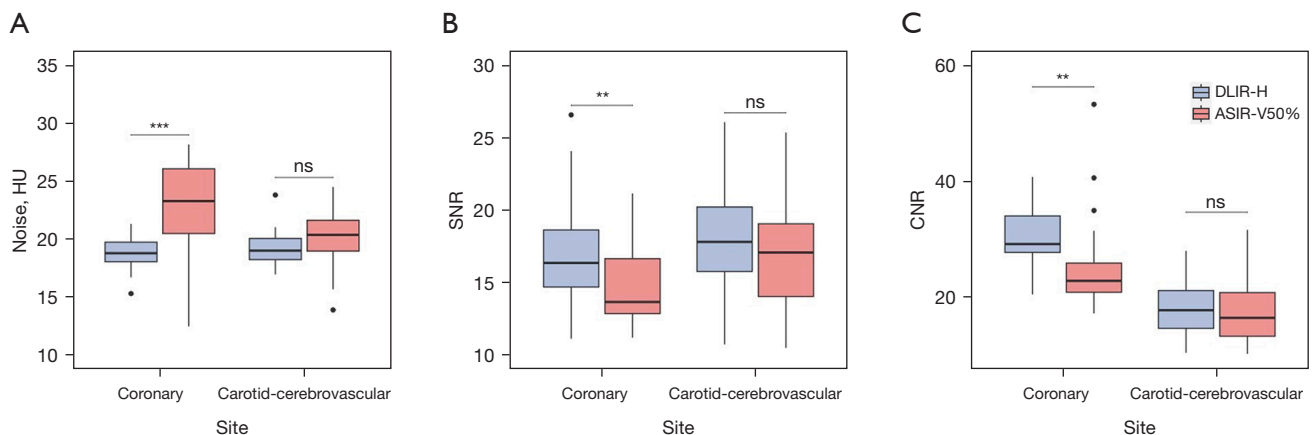
utilized DLIR-H algorithm to reconstruct one-stop CTA images for the first time and demonstrated its superiority again in preserving image quality under low radiation and contrast dose settings. By contrast, previously proposed one-stop CTA protocols were mainly based on IR algorithm and reported evidently higher image noise of 24.2–29.0 HU at the aorta root (15–17). We believe the higher noise in these studies was because under low radiation settings, IR would result in substantial image noise and affect the display of subtle imaging features (34,35). Considering all one-stop CTA protocols designed for simplifying the scanning process, with the double-low protocol we presented in our study, stroke patients would benefit from our protocol for more precise coronary atherosclerosis assessment. CAD patients could also receive screening for carotid-cerebrovascular stenosis at the same time as the coronary CTA examination. However, no guideline has clarified the indication for one-stop C&CC-CTA. Therefore, further studies are in need to determine the target population for this test.



**Table 4** Coronary section objective image quality comparison between two groups

Parameter	DLIR-H group (n=30)	ASIR-V50% group (n=30)	P value
Attenuation, HU			
RCA	464.47±77.48	438.77±72.39	0.190
LAD	455.87±68.67	444.27±71.49	0.524
LCX	439.53±80.29	419.37±75.19	0.320
SD <sub>vessel</sub> , HU			
RCA	25.40±3.57*	28.90±3.48	<0.001
LAD	28.64±4.15	30.18±5.55	0.228
LCX	29.29±5.24*	31.97±4.85	0.044
SNR			
RCA	18.66±4.31*	15.37±2.96	0.001
LAD	16.26±3.44	15.26±3.98	0.301
LCX	15.69±4.95*	13.37±2.91	0.032
CNR			
RCA	31.51±4.93*	25.21±8.40	<0.001
LAD	30.49±5.57*	25.43±8.08	0.007
LCX	29.36±6.31*	24.29±6.72	0.004
Noise, HU	18.93±1.43*	22.86±3.75	<0.001

Parametric continuous data are expressed as mean ± standard deviation. \*, significant difference from ASIR-V50% group. DLIR-H, deep learning image reconstruction-high; ASIR-V50%, 50% adaptive statistical iterative reconstruction-V; RCA, right coronary artery; LAD, left anterior descending artery; LCX, left circumflex artery; SD<sub>vessel</sub>, standard deviation of CT value measured at vessel; SNR, signal-to-noise ratio; CNR, contrast-to-noise ratio.



**Figure 4** Objective image quality comparison. Boxplot showed the comparison of image noise (A), mean SNR (B), mean CNR (C) between the two groups at different scanning sites. Error bars represent the standard deviation. ns,  $P>0.05$ ; \*\*,  $P<0.01$ ; \*\*\*,  $P<0.001$ . DLIR-H, deep learning image reconstruction-high; ASIR-V50%, 50% adaptive statistical iterative reconstruction-V; SNR, signal-to-noise ratio; CNR, contrast-to-noise ratio.

**Table 5** Objective analysis of carotid-cerebrovascular CTA

Parameter	DLIR-H group (n=30)	ASIR-V50% group (n=30)	P value
Attenuation, HU			
CCA	418.20±83.98	415.92±105.24	0.926
ICA	418.48±89.22	420.25±106.16	0.945
MCA	371.25±91.11	386.38±104.80	0.553
SD <sub>vessel</sub> , HU			
CCA	23.38±4.58	24.02±3.50	0.545
ICA	20.93±2.76*	23.93±4.28	0.002
MCA	24.88±4.37	25.98±4.86	0.362
SNR			
CCA	18.71±5.75	17.55±4.95	0.403
ICA	20.30±4.89	18.01±5.09	0.082
MCA	15.29±4.44	15.28±4.72	0.995
CNR			
CCA	17.31±4.79	15.82±5.34	0.260
ICA	19.53±5.59	19.58±6.31	0.973
MCA	16.06±5.27	17.12±6.45	0.489
Noise, HU			
CCA level	20.49±2.88*	23.06±3.90	0.005
ICA level	17.96±1.35	18.56±3.40	0.380
MCA level	19.30±3.04	19.07±3.09	0.769
Average	19.25±1.42	20.23±2.40	0.061

Parametric continuous data are expressed as mean ± standard deviation. \*, significant difference from AIR-V50% group. CTA, computed tomography angiography; DLIR-H, deep learning image reconstruction-high; ASIR-V50%, 50% adaptive statistical iterative reconstruction-V; CCA, common carotid artery; ICA, internal carotid artery; MCA, middle cerebral artery; SD<sub>vessel</sub>, standard deviation of CT value measured at vessel; SNR, signal-to-noise ratio; CNR, contrast-to-noise ratio.

The other advantage of our protocol was that we drastically reduced the total effective radiation dose to about 1.00 mSv. As the scanning area of one-stop CTA involves radiation-sensitive organs like thyroid gland and crystalline lens, reducing the radiation dose as much as possible is of essence to avoid the radiation-associated adverse events. With the application of DLIR algorithm, we performed CTA using the 80 kVp tube voltage, equal to the minimum tube voltage reported in the previous one-stop CTA studies reported by Zhao *et al.* (14). However, in their study, a further reduction of ED to 0.32±0.11 mSv was reported. They utilized the high-pitch scanning of dual-source CT (DSCT), with rapid gantry rotation and table-moving speed, to decrease radiation dose while preserving high

temporal resolution. However, coronary artery visualization by DSCT might be impaired with motion artifact when heart rate exceeds a certain level (36), as in the study by Zhao *et al.*, only patients with an HR below 70 bpm were included. In our study, the mean HR was 72.87±13.46 bpm and 4 arrhythmia patients were enrolled in the DLIR-H group, indicating our protocol can be applied to more patients and may be more suitable in clinical application.

Another advantage of our protocol was the significantly improved coronary artery image quality, both in objective and subjective evaluation. Although validation test in diagnostic accuracy was not performed in our study, with evidence from Benz, D. C.'s study indicating a non-inferior/superior diagnostic accuracy in coronary diseases with

CTA images using DLIR (37), we believe the diagnostic accuracy for coronary artery using our C&CC-CTA protocol should not be inferior to that of using conventional protocol. Nevertheless, for carotid and cerebrovascular vessels, we have to admit that the image quality was not significantly improved using DLIR-H under the lower-dose conditions. Similarly, all the former one-stop C&CC-CTA protocols reported comparable or even worse image quality at the same site (12,14,15). We speculate that it might be attributed to the order of scanning, as the carotid and cerebrovascular arteries were always scanned behind coronary arteries in the one-stop scanning process. Till now, only a few studies have been done to explore the application CTA images of DLIR in carotid and cerebrovascular vessel under lower radiation and contrast dose settings. Also, these studies could not reach a further decrease in image noise compared with the standard-dose protocol with ASIR-V algorithm (20,38). Even if a mean subjective score of 4.18 in our study proved that our carotid and cerebrovascular images were able to meet the diagnostic criteria, further studies to validate its impact on diagnostic accuracy are warranted to confirm its efficacy.

### Limitations

Even the results of this study were promising, several limitations should be noted. First, as a single center study, all individuals enrolled were routine patients referred to a simultaneously coronary and carotid artery CTA. The scale was limited, and multicenter studies are in need to validate this result. Second, our study evaluated the feasibility of our CTA protocol with vessel enhancement and image noise. Even though image quality which is closely related to diagnosis was rigorously tested in our study, at this stage, our results should not be expanded to diagnostic accuracy. Third, our study was limited to a cohort of BMI <25 kg/m<sup>2</sup>, restricting its applicability in obese patients. Finally, the scanning parameters of our protocol were selected based on previous research and our preliminary experiment results, and may not be most suitable for DLIR-H. Further evaluation is needed to assess the optimal settings for DLIR-H one-stop C&CC CTA.

### Conclusions

In conclusion, we evaluated the image quality of a one-stop C&CC-CTA under reduced radiation dose and contrast dose using DLIR-H. With this convolutional network-

based reconstruction algorithm, we managed to generate superior image quality for the coronary arteries and similar image quality for the carotid and cerebral arteries while achieving 48% and 30% reduction in radiation and contrast dose, respectively compared with the routine-dose protocol with ASIR-V50%. We also eliminated the restriction for heart rate in recent-proposed one-stop CTA protocols.

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### Footnote

*Reporting Checklist:* The authors have completed the STROBE reporting checklist. Available at <https://qims.amegroups.com/article/view/10.21037/qims-23-864/rc>

*Conflicts of Interest:* All authors have completed the ICMJE uniform disclosure form (available at <https://qims.amegroups.com/article/view/10.21037/qims-23-864/coif>). The authors have no conflicts of interest to declare.

*Ethical Statement:* The authors are accountable for all aspects of the work in ensuring that questions related to the accuracy or integrity of any part of the work are appropriately investigated and resolved. The study was conducted in accordance with the Declaration of Helsinki (as revised in 2013). The study was approved by the Ethics Committee of West China Hospital. All participants provided written informed consents.

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