



Standardized volumetric plaque quantification and characterization from coronary CT angiography: a head-to-head comparison with invasive intravascular ultrasound

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Abstract

Objectives We sought to evaluate the accuracy of standardized total plaque volume (TPV) measurement and low-density non-calcified plaque (LDNCP) assessment from coronary CT angiography (CTA) in comparison with intravascular ultrasound (IVUS).

Methods We analyzed 118 plaques without extensive calcifications from 77 consecutive patients who underwent CTA prior to IVUS. CTA TPV was measured with semi-automated software comparing both scan-specific (automatically derived from scan) and fixed attenuation thresholds. From CTA, %LDNCP was calculated voxels below multiple LDNCP thresholds (30, 45, 60, 75, and 90 Hounsfield units [HU]) within the plaque. On IVUS, the lipid-rich component was identified by echo attenuation, and its size was measured using attenuation score (summed score analysis length) based on attenuation arc (1 = < 90°; 2 = 90–180°; 3 = 180–270°; 4 = 270–360°) every 1 mm.

Results TPV was highly correlated between CTA using scan-specific thresholds and IVUS ($r = 0.943$, $p < 0.001$), with no significant difference (2.6 mm^3 , $p = 0.270$). These relationships persisted for calcification patterns (maximal IVUS calcium arc of 0°, < 90°, or ≥ 90°). The fixed thresholds underestimated TPV (-22.0 mm^3 , $p < 0.001$) and had an inferior correlation with IVUS ($p < 0.001$) compared with scan-specific thresholds. A 45-HU cutoff yielded the best diagnostic performance for identification of lipid-rich component, with an area under the curve of 0.878 vs. 0.840 for < 30 HU ($p = 0.023$), and corresponding %LDNCP resulted in the strongest correlation with the lipid-rich component size ($r = 0.691$, $p < 0.001$).

Conclusions Standardized noninvasive plaque quantification from CTA using scan-specific thresholds correlates highly with IVUS. Use of a < 45-HU threshold for LDNCP quantification improves lipid-rich plaque assessment from CTA.

Key Points

- Standardized scan-specific threshold-based plaque quantification from coronary CT angiography provides an accurate total plaque volume measurement compared with intravascular ultrasound.
- Attenuation histogram-based low-density non-calcified plaque quantification can improve lipid-rich plaque assessment from coronary CT angiography.

Keywords Atherosclerotic plaque · Computed tomography angiography · Interventional ultrasonography

Hidenari Matsumoto and Satoshi Watanabe contributed equally to this work.

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Abbreviations

CTA	Coronary CT angiography
HU	Hounsfield units
IQR	Interquartile range
IVUS	Intravascular ultrasound
LDNCP	Low-density non-calcified plaque
TPV	Total plaque volume

Introduction

The lipid-rich component is considered one of the major histopathologic features of high-risk coronary plaques prone to rupture [1–3]. Noninvasive imaging has, therefore, focused on identifying the lipid-rich component. On coronary CT angiography (CTA), the lipid-rich component is identified as low-density non-calcified plaque (LDNCP) [2, 4–7]. Landmark CTA studies have shown that the presence of LDNCP defined as < 30 HU is more frequent in patients with acute coronary syndrome than in patients in stable coronary artery disease [8] and is associated with subsequent coronary artery disease events [9].

Binary detection of LDNCP on two-dimensional cross sections used in most CTA studies [4, 6–9] can be affected by the location and/or size of regions of interest and contrast enhancement [10, 11], which have been shown to be inconsistent in prior reports [4, 5, 7]. In addition, a two-dimensional analysis based on mean HU hampers an assessment of the extent of the lipid-rich component. Volumetric analyses based on histogram analysis providing the volume or burden of LDNCP, which is independent of regions of interest, have additional clinical value [12–14]. Thus far, no *in vivo* study has investigated volumetric LDNCP measurement with varying HU thresholds on CTA compared with IVUS.

The aim of this study was to examine the accuracy of semi-automated TPV quantification and lipid-rich plaque assessment using attenuation histogram-based LDNCP analysis, in a head-to-head comparison with IVUS.

Materials and methods

All imaging studies were clinically indicated. The study protocol was approved by the local ethics committee, and written informed consent was obtained from all patients for the use of their data for research.

Patients

This retrospective study included 77 consecutive patients with known or suspected coronary artery disease who underwent CTA before IVUS within a period of 1 month at Kusatsu Heart Center. Exclusion criteria are composed of poor image

quality on CTA or IVUS, patients with acute myocardial infarction, stented lesions, predilatation before IVUS examination, or presence of extensive acoustic shadowing from calcification (arc of $\geq 90^\circ$ and ≥ 3 mm in length) on IVUS, which precludes accurate measurement of vessel and plaque by IVUS (Supplement).

Image acquisition

IVUS

All IVUS examinations were performed prior to percutaneous coronary intervention in a standard fashion with commercially available 40-MHz imaging catheters (Boston Scientific or Terumo) as described previously [15]. The imaging catheter was advanced beyond the distal portion of the target lesion for percutaneous coronary intervention, and automated pullback was performed at a rate of 0.5 mm/s.

CTA

CTA images were acquired with a 64-detector scanner (Lightspeed VCT, GE Healthcare) utilizing prospective ECG-gating or retrospective ECG-gating with tube current modulation. All patients received nitroglycerin for coronary vasodilation, and those with a heart rate over 60 beats per minute were given beta-blockers unless a contraindication was present. An intravenous bolus of iopamidol (Iopamiron 370, Schering) was continuously injected for 10–12 s, depending on the scan length, followed by a 20:80 admixture of contrast agent (25 ml). The injection rate of contrast agent was adjusted according to body weight (2.7–5.6 ml/s) [16]. Real-time bolus-tracking technique was used to trigger scan initiation. The scan parameters were collimation of 64×0.625 mm, rotation time of 350 ms, tube voltage of 100 or 120 kV, and tube current of 450–780 mAs. Transaxial images were reconstructed with filtered backprojection reconstruction algorithm at the cardiac phase exhibiting minimal cardiac motion. Image reconstruction parameters comprised the individually adapted field of view, matrix size of 512×512 pixels, and a medium-soft tissue convolution kernel.

Data analysis

IVUS

IVUS analysis was performed as reported previously [15] using dedicated software (echoPlaque, INDEC Medical Systems) by experienced observers, who were blinded regarding the result of CTA. We identified intracoronary atherosclerotic lesions on IVUS with maximal plaque thickness of > 1.0 mm and plaque burden (vessel area – plaque area) of $\geq 40\%$ [17, 18]. The proximal and distal reference segments

were selected at the most adjacent points to the maximal stenosis in which there was minimal or no plaque. Vessel (external elastic membrane) and lumen contours were manually delineated every 1 mm, and TPV was calculated as the vessel volume minus the lumen volume.

Calcium was defined by the presence of a bright echogenic signal with acoustic shadowing. The arc of acoustic shadowing was measured in degrees with a protractor centered on the lumen every 1 mm, and the maximal arc of calcium deposit was identified. Spotty and large calcifications were defined as calcium deposits with an arc of $< 90^\circ$ and $\geq 90^\circ$, respectively [19, 20]. The lipid-rich component was identified by superficial echo attenuation (leading edge of attenuation closer to the lumen than to the adventitia) despite the absence of bright calcium [21–23]. The arcs of attenuation were measured in degrees with a protractor centered on the lumen every 1 mm and were graded based on a 5-point scale (0, no attenuation; 1, $0\text{--}90^\circ$; 2, $90\text{--}180^\circ$; 3, $180\text{--}270^\circ$; 4, $270\text{--}360^\circ$) to create the mean attenuation score (summed score / analysis length) [24].

CTA

Quantitative analysis of CTA images was performed with dedicated software (Autoplaque version 2.0, Cedars-Sinai Medical Center) by an independent observer blinded to IVUS findings as previously described (details in Supplement) [11, 25, 26]. Excellent intra-observer reproducibility and inter-observer reproducibility have been previously reported [25, 27]. Plaque co-registration between CTA and IVUS was performed by another investigator, who was not involved in the other processing of CTA analysis. Stretched multiplanar reconstruction and cross-sectional CTA images were used to compare IVUS images. The proximal and distal reference limits of the plaque were matched to IVUS using anatomical landmarks, such as the distance from the aorto-coronary ostium, target lesions, side branches, or calcifications. Plaque volumes for total and each component were automatically quantified using scan-specific thresholds. The plaque composition was derived as (plaque component volume / TPV) \times 100 (%). For quantitative LDNCP analysis, the percentages of voxels below multiple LDNCP thresholds (30, 45, 60, 75, or 90 HU) within the plaque were calculated from CTA. CT attenuation of voxels located < 0.5 mm inward from the vessel boundaries was considered to be within the LDNCP threshold due to partial volume effects between the plaque and epicardial fat tissue; these voxels were excluded from the measurement of LDNCP in this study using standardized “erosion” from the vessel centerline. When there was a difference in lesion length between two modalities (possibly due to catheter-induced deformation of the coronary artery, cardiac motion, or pullback speed variations), volume parameters in CTA were corrected by the lesion length (volume parameters in CTA \times the lesion length in IVUS / the lesion length in CTA) [28]. An example of semi-

automated TPV quantification from CTA is shown in Fig. 1. TPV was also quantified using previously reported fixed HU thresholds (non-calcified plaque, < 150 HU; lumen, $150\text{--}500$ HU; calcified plaque, > 500 HU) [29, 30].

Statistical analysis

Statistical analysis was performed with SPSS Statistics 24 (IBM Corporation). Quantitative variables were expressed as median with interquartile range (IQR). Categorical variables were expressed as frequencies or percentages. Intra-observer agreement and inter-observer agreement for calcification and echo attenuation on IVUS assessment were examined using Cohen’s kappa coefficient and Bland-Altman analysis. Correlations between two variables were assessed with Spearman’s rank correlation coefficient. The Wilcoxon signed-rank test was used to compare TPV between IVUS and CTA. The agreement of TPV between IVUS and CTA was examined using Bland-Altman analysis. Two dependent correlations being equal using Fisher’s z -transformation was used to compare CTA TPV between the scan-specific and fixed thresholds. The receiver operating characteristic analysis was applied to determine the diagnostic performance for identification of IVUS-verified lipid-rich component at each LDNCP threshold [31]. A p value < 0.05 was considered statistically significant.

Results

Patient characteristics and IVUS findings

A total of 118 atherosclerotic plaques from 77 patients were examined. CTA was performed at 100 kV in 32 patients (42%) and at 120 kV in 45 (58%). Clinical characteristics are listed in Table 1. On IVUS, 54 (46%) and 41 (35%) plaques were accompanied by spotty and large calcifications, respectively. The remaining 23 (19%) plaques were unaccompanied by any calcification. The lipid-rich component was observed in 63 (53%) plaques.

Reproducibility of IVUS plaque measurements

Intra-observer and inter-observer reproducibility for calcification patterns, presence of echo attenuation, and the mean attenuation score on IVUS assessment were evaluated in randomly selected 20 patients (36 plaques). Intra-observer agreement and inter-observer agreement for calcification patterns (no, spotty, or large calcification) were κ values of 0.91 and 0.87 ($p < 0.001$ for both), respectively. The mean differences in the maximal calcium arc (with the 95% limits of agreement) were -0.1° (-11.1 to 10.8°) and -0.8° (-13.4 to 11.8°) for intra-observer and inter-observer measurement, respectively. For presence of echo attenuation, intra-observer agreement

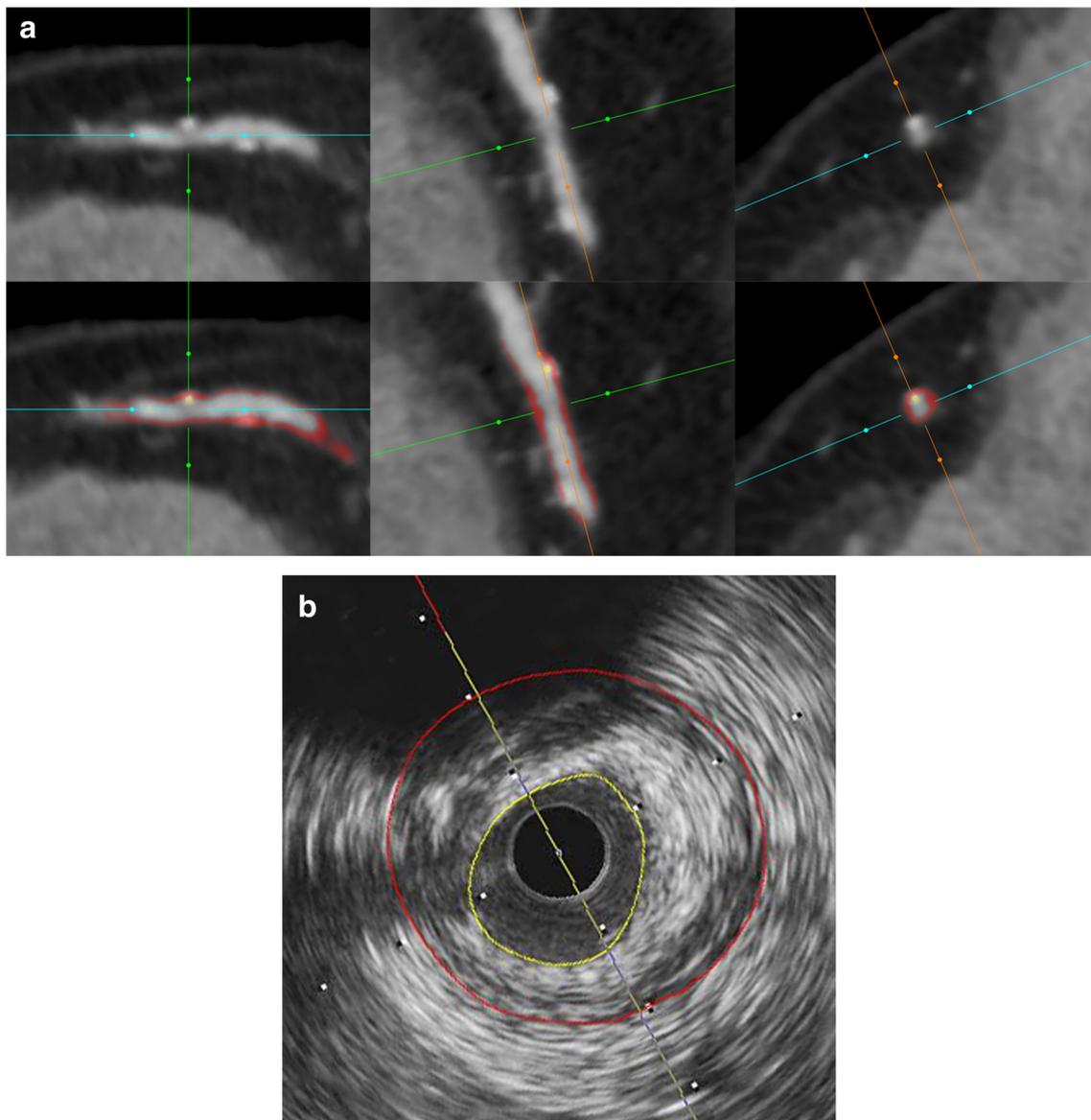


Fig. 1 An example of semi-automated quantification from CTA. **a** Cross-sectional and double oblique CTA images of multiplanar reconstruction showing non-calcified plaque with spotty calcification without (top) or with (bottom) color-coded overlay from automated plaque quantification.

Yellow overlay corresponds to calcified plaque and red to non-calcified plaque. **b** Corresponding IVUS cross section with external elastic membrane (red) and lumen (yellow) contours. CTA, coronary CT angiography; IVUS, intravascular ultrasound

and inter-observer agreement were κ values of 0.94 and 1.0 ($p < 0.001$ for both), respectively. The mean differences in the mean attenuation score (with the 95% limits of agreement) were -0.009 (-0.280 to 0.261) and -0.012 (-0.289 to 0.265) for intra-observer and inter-observer measurement, respectively.

Comparison of TPV

CTA and IVUS

Due to extensive echo attenuation on IVUS precluding measurement, 4 plaques from 4 patients were excluded from the

TPV analysis. In all the other plaques, the median scan-specific attenuation thresholds were -19 HU (IQR -30 to -9) for epicardial fat, 193 HU (IQR 165 to 213) for the upper level of non-calcified plaque, and 505 HU (IQR 460 to 550) for the lower level of calcified plaque, respectively.

Figure 2a displays a scatter plot of CTA TPV quantified with scan-specific thresholds and IVUS TPV. TPV was highly correlated between CTA and IVUS ($r = 0.943$, $p < 0.001$). Table 2 summarizes comparisons of TPV between CTA and IVUS according to various lesion subsets. The relationships persisted for all calcification patterns and presence of lipid-rich component ($p < 0.001$ for all). By Bland-Altman analysis, the mean difference was 2.6 mm^3 , and the 95% limits of

Table 1 Clinical characteristics and plaque morphology

No. of patients	77
Age (years)	68 (60–76)
Male, <i>n</i> (%)	61 (79)
Weight (kg)	61.1 (52.5–70.0)
Body mass index (kg/m ²)	23.5 (21.3–24.9)
Clinical characteristics	
Stable angina/unstable angina, <i>n</i> (%)	62 (81)/15 (19)
Hypertension, <i>n</i> (%)	61 (79)
Diabetes mellitus, <i>n</i> (%)	33 (43)
Dyslipidemia, <i>n</i> (%)	38 (49)
Current smoking, <i>n</i> (%)	12 (16)
Target vessel (LAD/LCX/RCA), <i>n</i> (%)	50 (65)/5 (7)/22 (29)
No. of plaques	118
Plaque morphology on IVUS	
Pattern of calcification	
No calcification, <i>n</i> (%)	23 (19)
Spotty calcification, <i>n</i> (%)	54 (46)
Large calcification, <i>n</i> (%)	41 (35)
Superficial echo attenuation, <i>n</i> (%)	63 (53)

Values are expressed as median (interquartile range) or *n* (%)

IVUS, intravascular ultrasound; LAD, left anterior descending coronary artery; LCX, left circumflex coronary artery; LM, left main; RCA, right coronary artery

agreement were -49.3 to 54.4 mm³ (Fig. 2b). TPV was not significantly different between CTA and IVUS (158.9 mm³ [IQR 106.8–228.3] vs. 152.1 mm³ [IQR 104.0–234.7], $p = 0.270$). The differences were not significant irrespective of calcification patterns ($p = 0.784$, $p = 0.542$, and $p = 0.232$ for no, spotty, and large calcification, respectively) and presence of lipid-rich component ($p = 0.566$ and $p = 0.307$ for presence and absence of lipid-rich component, respectively). When CTA TPV was not corrected (166.6 mm³ [IQR 106.4–234.8]) by the lesion length (CTA, 19.9 mm [IQR 13.9–24.3] vs. IVUS, 19.2 mm [IQR 13.3–23.5], $p < 0.001$), the mean difference from IVUS TPV was 6.7 mm³ ($p = 0.006$), and the 95% limits of agreement were -43.9 to 57.3 mm³. The correlation with IVUS TPV persisted ($r = 0.944$, $p < 0.001$) without the correction.

Scan-specific thresholds vs. fixed thresholds

CTA TPV quantified with the fixed thresholds also correlated well with IVUS TPV ($r = 0.915$, $p < 0.001$) (Fig. 3a); CTA with the fixed thresholds significantly underestimated TPV (127.3 mm³ [IQR 83.1–208.8] vs. 152.1 mm³ [IQR 104.0–234.7], $p < 0.001$). Compared with scan-specific thresholds, the fixed thresholds had a greater bias with wider limits of agreement (-22.0 mm³ with -92.7 to 48.7 mm³) (Fig. 3b) and an inferior correlation with IVUS ($p < 0.001$).

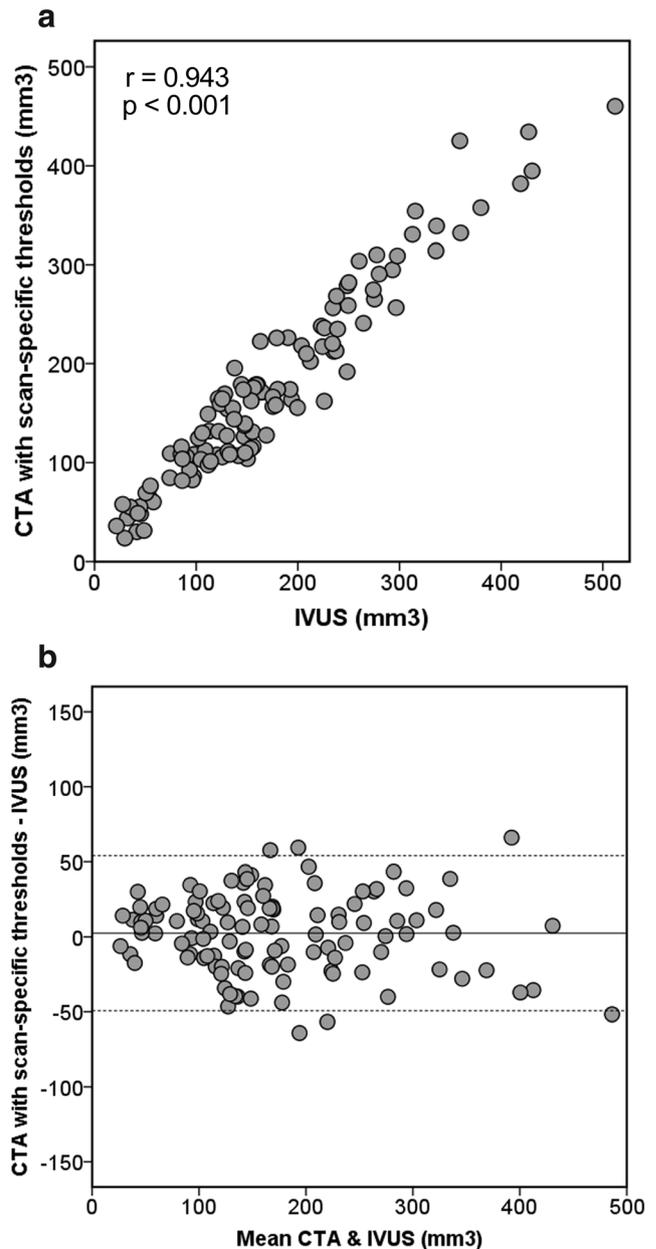


Fig. 2 Comparison of total plaque volume between CTA with scan specified thresholds and IVUS. **a** Scatterplot. **b** Bland-Altman plot. The solid line is the mean bias (2.6 mm³), and the dashed lines represent the 95% limits of agreement (-49.3 to 54.4 mm³). CTA, coronary CT angiography; IVUS, intravascular ultrasound

Assessment of lipid-rich component by volumetric LDNCP measurement

Table 3 summarizes plaque compositions from CTA quantified using scan-specific thresholds for plaques with and without lipid-rich component. The percentages of non-calcified and calcified plaque were not significantly different between plaques with lipid-rich component and those without. Plaques with lipid-rich component had significantly greater percentages of LDNCP than those without lipid-rich component for

Table 2 Comparison of total plaque volume between CTA with scan-specific thresholds and IVUS according to lesion subtypes

	n	CTA median (IQR) (mm ³)	IVUS median (IQR) (mm ³)	p value	Mean bias (CTA – IVUS) (mm ³)	Limits of agreement (mm ³)	Correlation coefficient	p value
All	114	158.8 (106.8–228.3)	152.1 (104.0–234.7)	0.270	2.6	–49.3 to 54.4	0.943	< 0.001
Pattern of calcification								
No calcification	23	131.9 (84.5–218.1)	130.9 (74.0–203.6)	0.784	–1.1	–37.9 to 35.6	0.965	< 0.001
Spotty calcification	51	137.6 (108.4–212.9)	147.4 (96.2–226.0)	0.542	1.5	–50.6 to 53.6	0.927	< 0.001
Large calcification	40	169.9 (114.2–300.5)	159.8 (126.8–279.4)	0.232	6.1	–52.7 to 64.8	0.945	< 0.001
Lipid-rich component								
+	59	202.1 (139.4–258.8)	199.6 (136.0–250.1)	0.566	2.1	–53.5 to 57.8	0.941	< 0.001
–	55	114.1 (82.4–166.2)	122.0 (74.0–155.3)	0.307	3.0	–44.8 to 50.9	0.901	< 0.001

CTA, coronary CT angiography; IQR, interquartile range; IVUS, intravascular ultrasound

all LDNCP thresholds ($p < 0.001$ for all). Figure 4 shows an example of LDNCP on CTA with the corresponding IVUS cross section with the lipid-rich component.

Figure 5 demonstrates the diagnostic performance of volumetric LDNCP measurement at varying thresholds for identification of lipid-rich component. On the receiver operating characteristic analysis, the best diagnostic performance was obtained by a 45-HU cutoff, with an area under the curve of 0.878 (95% confidence interval 0.816–0.941). Of the HU thresholds studied, the generally accepted 30-HU threshold resulted in the smallest area under the curve of 0.840 (95% confidence interval 0.784–0.922, $p = 0.023$ vs. 45 HU).

Figure 6 displays scatter plots of the lipid-rich component size, expressed as the mean attenuation score, and %LDNCP at various HU cutoffs. %LDNCP correlated with the lipid-rich component size at all HU thresholds, and the strongest correlation was observed at a 45-HU cutoff ($r = 0.644$, 0.691, 0.659, 0.649, and 0.646 for 30, 45, 60, 75, and 90 HU, respectively, $p < 0.001$ for all).

Discussion

The major findings in the present study are summarized as follows: (1) Automated scan-specific threshold level-based TPV from CTA highly correlated with IVUS TPV irrespective of lesion subsets and (2) A < 45-HU threshold for volumetric LDNCP measurement provided the optimum assessment of lipid-rich component.

Measurement of TPV

Intravascular imaging has been widely used as a reference standard for plaque quantification as well as plaque characterization [15, 17, 21, 32]. However, it is invasive and its use is limited to specific lesions only. CTA is a more attractive alternative to intravascular imaging, allowing noninvasive plaque assessment in the whole coronary tree in a broad range of population. A recent serial CTA study has demonstrated that quantitative plaque assessment provides additional values in

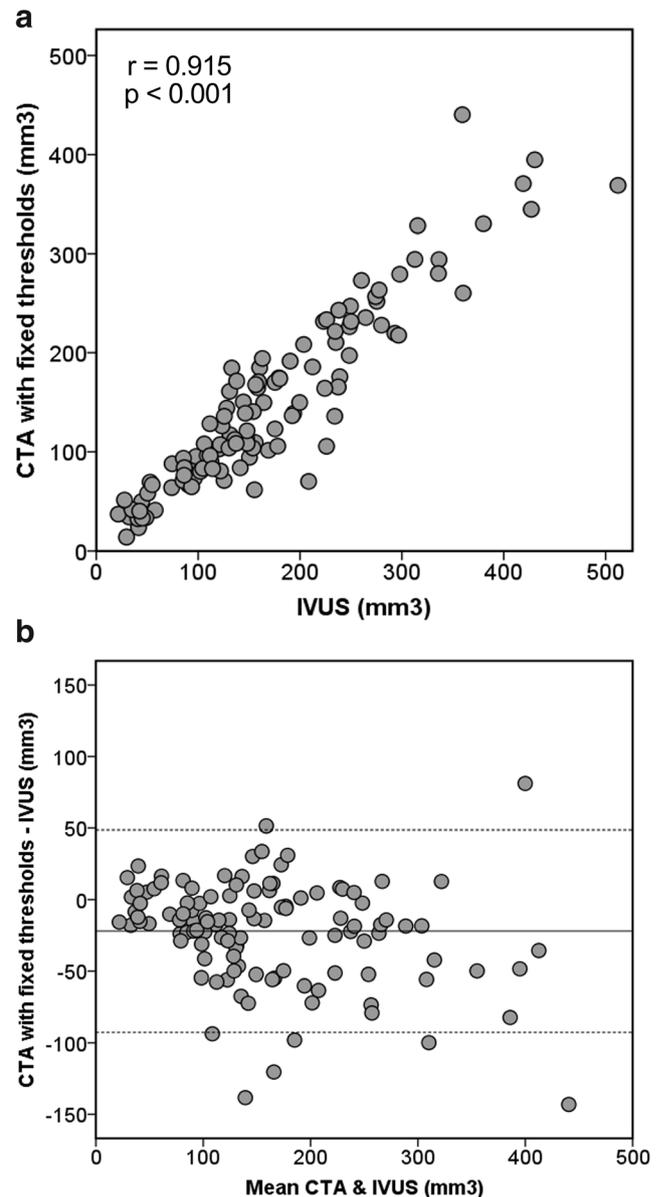


Fig. 3 Comparison of total plaque volume between CTA with fixed thresholds and IVUS. **a** Scatterplot. **b** Bland-Altman plot. The solid line is the mean bias (-22.0 mm³), and the dashed lines represent the 95% limits of agreement (-92.7 to 48.7 mm³). CTA, coronary CT angiography; IVUS, intravascular ultrasound

Table 3 Comparison of plaque composition between plaques with and without lipid-rich component

Plaque composition	Lipid + (n = 63)	Lipid - (n = 55)	p value
Calcified plaque (%)	3.17 (0.00–10.48)	4.86 (0.40–14.54)	0.149
Non-calcified plaque (%)	96.83 (89.52–100.00)	95.14 (85.46–99.60)	0.149
LDNCP < 30 HU (%)	0.55 (0.12–1.54)	0.00 (0.00–0.04)	< 0.001
LDNCP < 45 HU (%)	1.44 (0.52–3.38)	0.00 (0.00–0.19)	< 0.001
LDNCP < 60 HU (%)	3.10 (1.37–8.18)	0.18 (0.00–0.79)	< 0.001
LDNCP < 75 HU (%)	5.86 (2.49–10.50)	0.49 (0.00–1.73)	< 0.001
LDNCP < 90 HU (%)	9.34 (4.13–14.52)	1.05 (0.06–3.58)	< 0.001

Values are expressed as median (interquartile range)

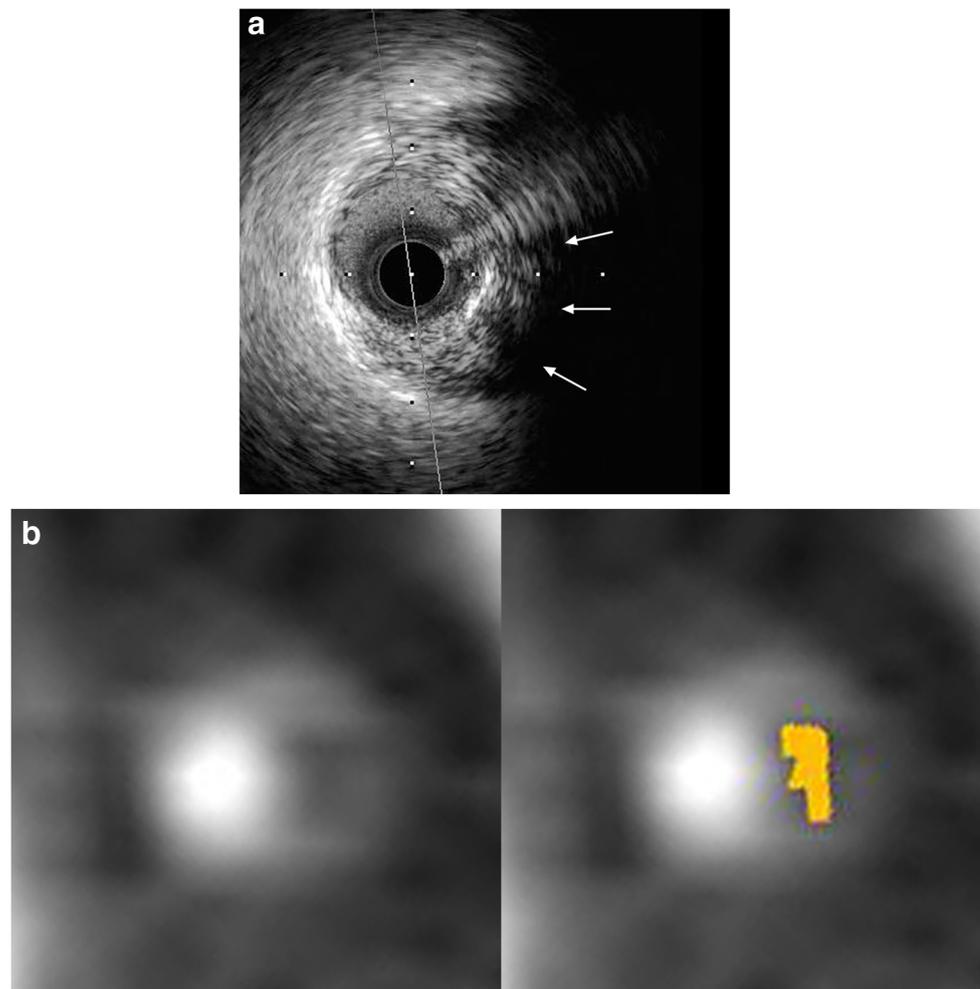
LDNCP, low-density non-calcified plaque

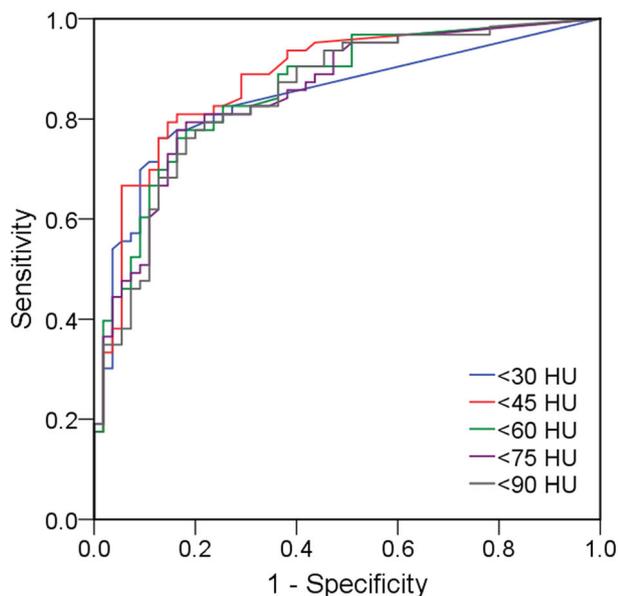
predicting future cardiac events over conventional assessment based on stenosis and/or qualitative plaque analysis [33].

Although the manual method is still standard for plaque quantification on CTA [34], it is time-consuming and dependent on visual inspection by observers. Several semi-automated techniques have been proposed to overcome the limitations. HU thresholds are commonly used to define plaque components and lumen [8, 11, 25, 26, 29, 30]. It has

been demonstrated that plaque attenuation is dependent on luminal contrast opacification [10, 35, 36]. Luminal contrast enhancement varies widely among individuals and/or scans as a number of patient-related and CT scanning-related factors affect contrast enhancement [37]. Therefore, optimal HU thresholds for plaque should be scan-specific. CTA TPV quantified with scan-specific attenuation thresholds has been shown to have a high correlation with IVUS TPV in non-

Fig. 4 An example of IVUS-verified lipid-rich component with corresponding cross-sectional CTA images. **a** IVUS cross section with superficial echo attenuation (arrows). **b** Corresponding CTA cross sections with (left) and without (right) color-coded overlay from low-density non-calcified plaque quantification. Light brown overlay indicates pixels with < 45 Hounsfield units. CTA, coronary CT angiography; IVUS, intravascular ultrasound





	%LDNCP cut-off	AUC (95% CI)	p value*	Sensitivity (95% CI)	Specificity (95% CI)
<30 HU	0.12	0.840 (0.770–0.910)	NA	0.758 (0.633–0.858)	0.857 (0.738–0.936)
<45 HU	0.54	0.878 (0.816–0.941)	0.023	0.758 (0.633–0.858)	0.875 (0.759–0.948)
<60 HU	1.37	0.860 (0.794–0.926)	0.356	0.774 (0.650–0.871)	0.839 (0.717–0.924)
<75 HU	2.43	0.855 (0.787–0.923)	0.552	0.790 (0.668–0.883)	0.839 (0.717–0.924)
<90 HU	4.13	0.853 (0.784–0.922)	0.638	0.774 (0.650–0.871)	0.821 (0.696–0.911)

Fig. 5 Diagnostic performance of volumetric LDNCP measurement at various HU cutoffs for identification of IVUS-verified lipid-rich component. *vs. < 30 HU. AUC, area under the curve; CI, confidence interval; HU, Hounsfield units; LDNCP, low-density non-calcified plaque; IVUS, intravascular ultrasound; NA, not applicable

calcified plaques [26]. In a prior study, the fixed HU threshold of 150 HU for the lower level of lumen (i.e., the upper level of non-calcified plaque) yielded a small difference in TPV (3.8 mm^3) from IVUS TPV [30], whereas the fixed threshold significantly underestimated TPV in our patient group. The scan-specific threshold for the lower level of lumen used in the present study was higher (median 193 HU, IQR 165–213 HU) than the fixed threshold of 150 HU. These might explain, in part, our findings.

Interestingly, the lesion length by CTA was somewhat longer compared with that with IVUS despite registration of studied lesions between the two modalities using anatomical landmarks. This difference might be attributed to the inherent differences between invasive IVUS imaging within the vessel and x-ray transmission through the heart by noninvasive CTA. Since differences in lesion length directly affect volumetric measurements, the finding should be taken into account when comparing volumetric parameters between invasive and noninvasive modalities.

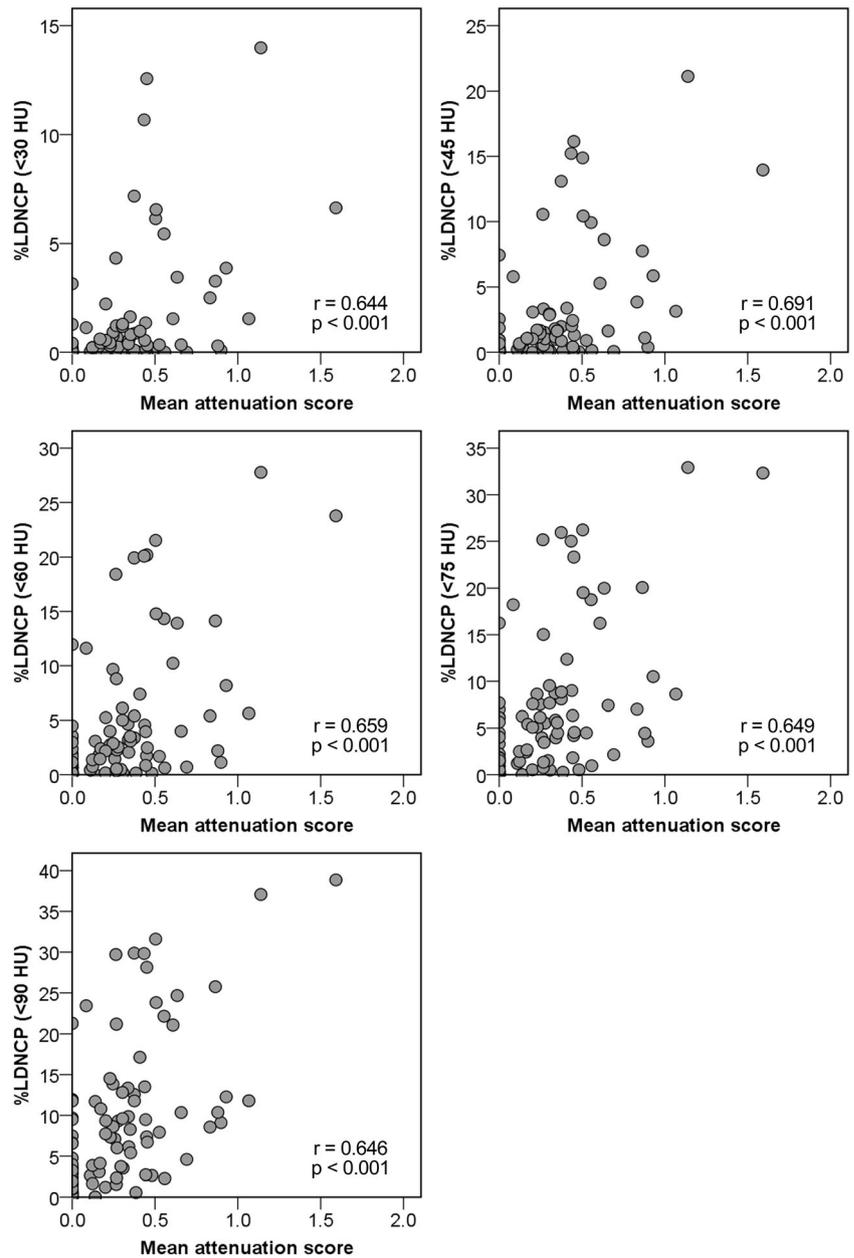
Three-dimensional histogram-based lipid-rich plaque characterization

CTA can non-invasively characterize coronary plaque based on differences in plaque attenuation [2, 4–7]. Even though mean HU-based criteria on a cross section are widely used [2, 4, 5, 7–9], there are several drawbacks. Various components often coexist in coronary atherosclerotic plaques [6, 21, 38], which can cause substantial overlaps in the distribution of mean HU value between lipid-rich and fibrous plaques [5, 7]. In addition, differences in methodology resulted in a wide variation in reported attenuation values for lipid-rich plaque [4–7].

To overcome the limitations of the HU-based criteria on a cross section, several reports have proposed histogram-based LDNCP analyses, which are independent of regions of interest. Ex vivo studies using two-dimensional quantitative histogram analysis reported AUCs of 0.65 and 0.74 for detection of lipid-rich plaque [6, 39]. The current study using three-dimensional histogram analysis yielded better diagnostic performance compared with the prior reports using two-dimensional analysis. Marwan et al. demonstrated that in non-calcified plaques, quantitative histogram analysis using a threshold of 30 HU identified lipid-rich plaques defined by IVUS with high sensitivity and specificity [5]. To our knowledge, this is the first to reveal the feasibility of three-dimensional quantitative LDNCP analysis in various plaque subtypes in vivo. Of the HU thresholds studied between 30 and 90 HU, the generally accepted 30-HU threshold had the lowest diagnostic performance in a real-world patient population, and a 45-HU threshold was found to be optimal for identification of lipid-rich component using volumetric LDNCP analysis in this study population.

Beyond binary detection of the lipid-rich component, estimation of its size is of clinical importance. On grayscale IVUS, superficial echo attenuation is considered to be the most reliable signature for identifying a high-risk plaque corresponding to histologically verified lipid-rich necrotic core [21]. Its extent is associated with poor clinical outcomes [20, 24, 40, 41]. Since the standard HU-based characterization on a cross section precludes assessment of the lipid-rich component size, three-dimensional histogram-based LDNCP analysis could provide incremental prognostic information as well as more accurate and objective risk stratification of coronary plaque. In the present study, we demonstrated correlations between %LDNCP and the lipid-rich component size on IVUS, expressed as the mean attenuation score, for kV settings of 100 kV and 120 kV, which are used most often for CTA. In line with the best threshold for the identification of lipid-rich plaque component, a 45-HU threshold yielded the best correlation with the lipid-rich component

Fig. 6 Correlations of %LDNCP at various HU cutoffs with IVUS-verified lipid-rich component. HU, Hounsfield units; LDNCP, low-density non-calcified plaque; IVUS, intravascular ultrasound



size for our data, which may be of importance in future clinical research studies.

Clinical implications

The clinical importance of plaque quantification from CTA has been shown in several clinical studies. Our results confirm the accuracy of automated scan-specific threshold-based TPV measurement for various plaque subtypes from noninvasive CTA. Accurate assessment of LDNCP provided by the three-dimensional volumetric measurement with the <45-HU threshold could enhance further risk stratification and enable evaluation of therapy in longitudinal studies.

Limitations

We acknowledge several limitations. First, this was a single-center retrospective study. Second, IVUS evaluations were limited to coronary arteries with significant stenosis, in which percutaneous coronary intervention was clinically indicated. We also included mild to moderate lesions in the same vessel, which were not targeted for revascularization, to compensate for this limitation. Third, CTA data were reconstructed with a filtered backprojection reconstruction method. Since newer technologies include varying levels/types of iterative reconstruction, CTA data reconstructed with filtered backprojection was chosen to ensure a consistent reconstruction and image noise level. Fourth, we excluded heavily calcified lesion

which precludes accurate plaque assessment with IVUS and thus cannot be reasonably included in a head-to-head comparison with CT. Last, in a clinical setting where histological analysis is not feasible, cardiovascular events could be the gold standard for the true high-risk plaque. Further investigation is necessary whether volumetric LDNCP analysis improves prediction of cardiovascular events.

Conclusions

Standardized plaque quantification from noninvasive coronary CT angiography provides accurate total plaque volume measurement compared with IVUS. Attenuation histogram-based LDNCP quantification can improve lipid-rich plaque assessment from coronary CT angiography.

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Compliance with ethical standards

Guarantor The scientific guarantor of this publication is Damini Dey, PhD.

Conflict of interest Damini Dey, Sebastien Cadet, Piotr J Slomka, and Daniel S Berman received software royalties from Cedars-Sinai Medical Center; Damini Dey, Piotr J Slomka, and Daniel S Berman have a patent.

Statistics and biometry One of the authors has significant statistical expertise.

Informed consent Written informed consent was obtained from all subjects (patients) in this study.

Ethical approval Institutional Review Board approval was obtained.

Methodology

- retrospective
- diagnostic study
- performed at one institution

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