Fully Automatic Software for Retinal Thickness in Eyes With Diabetic Macular Edema From Images Acquired by Cirrus and Spectralis Systems

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Citation: Lee JY, Chiu SJ, Srinivasan PP, et al. Fully automatic software for retinal thickness in eyes with diabetic macular edema from images acquired by Cirrus and Spectralis systems. *Invest Ophthalmol Vis Sci.* 2013;54:7595-7602. DOI:10.1167/ iovs.13-11762 **PURPOSE.** To determine whether a novel automatic segmentation program, the Duke Optical Coherence Tomography Retinal Analysis Program (DOCTRAP), can be applied to spectral-domain optical coherence tomography (SD-OCT) images obtained from different commercially available SD-OCT in eyes with diabetic macular edema (DME).

METHODS. A novel segmentation framework was used to segment the retina, inner retinal pigment epithelium, and Bruch's membrane on images from eyes with DME acquired by one of two SD-OCT systems, Spectralis or Cirrus high definition (HD)-OCT. Thickness data obtained by the DOCTRAP software were compared with those produced by Spectralis and Cirrus. Measurement agreement and its dependence were assessed using intraclass correlation (ICC).

RESULTS. A total of 40 SD-OCT scans from 20 subjects for each machine were included in the analysis. Spectralis: the mean thickness in the 1-mm central area determined by DOCTRAP and Spectralis was $463.8 \pm 107.5 \,\mu\text{m}$ and $467.0 \pm 108.1 \,\mu\text{m}$, respectively (ICC, 0.999). There was also a high level agreement in surrounding areas (out to 3 mm). Cirrus: the mean thickness in the 1-mm central area was $440.8 \pm 183.4 \,\mu\text{m}$ and $442.7 \pm 182.4 \,\mu\text{m}$ by DOCTRAP and Cirrus, respectively (ICC, 0.999). The thickness agreement in surrounding areas (out to 3 mm) was more variable due to Cirrus segmentation errors in one subject (ICC, 0.734–0.999). After manual correction of the errors, there was a high level of thickness agreement in surrounding areas (ICC, 0.997–1.000).

CONCLUSIONS. The DOCTRAP may be useful to compare retinal thicknesses in eyes with DME across OCT platforms.

Keywords: diabetic macular edema (DME), spectral-domain optical coherence tomography (SD-OCT), segmentation

Diabetic macular edema (DME) is the primary cause of decreased visual acuity in eyes with diabetic retinopathy and is the main cause of blindness in working age individuals.¹ The Early Treatment of Diabetic Retinopathy Study (ETDRS) found that clinically significant macular edema (CSME) led to moderate visual loss in 25% of patients within 3 years, and that grid or focal laser photocoagulation reduced the risk.² Recently, it has been shown that intravitreal corticosteroid and antivascular endothelial growth factor injections with focal laser photocoagulation improve visual acuity in individuals with DME.³ To effectively manage these patients, it is essential to monitor macular edema on an ongoing basis.

Optical coherence tomography (OCT) is a noninvasive imaging technique for obtaining high-resolution cross-sectional images of the retina and has been widely used to monitor changes in retinal thickness and morphology in eyes with DME.⁴ Accurate measurement of retinal layer thickness depends on well-resolved images obtained by the OCT system and accurate segmentation of retinal boundaries by the OCT

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instrument's analysis software. Currently, many types of OCT systems are used clinically, including the Stratus time domain OCT (TD-OCT) system (Carl Zeiss Meditec, Dublin, CA) as well as spectral-domain OCT (SD-OCT) systems such as the Cirrus HD-OCT (Carl Zeiss Meditec) and Spectralis (Heidelberg Engineering, Heidelberg, Germany) systems. Although each OCT system possesses its own intrinsic software to segment the retina, each OCT system's software segmentation algorithm uses a different reference line to identify the outer retinal boundary.⁵⁻⁸

Retinal thickness measurement differences produced by different OCT software algorithms are important and can adversely affect the interpretation of DME retinal thickness changes in response to therapy when applied to clinical practice and trial outcomes. For example, in DME multicenter clinical trials, it is not possible to directly compare retinal thicknesses among eyes in which thickness measurements have been obtained by different systems. In the clinic, it may be difficult to assess retinal thickness changes when a patient has



FIGURE 1. (A) Unaltered Spectralis SD-OCT segmentation of the retina/RPE (*lines* at ILM and outer RPE/Bruch's membrane). (B) Outer segmentation *line* moved by the reader to the inner RPE border to isolate the retina. (C) Unaltered Cirrus SD-OCT segmentation of the inner retina (*lines* at the ILM and a region just external to the inner RPE). (D) Outer segmentation *line* moved by the reader to the outer RPE/Bruch's membrane to isolate the retina/RPE.

been referred from an outside practitioner's office where retinal thickness was determined on a different OCT system. If the outer retinal segmentation line is adjusted manually by the OCT system's software to a common outer retinal boundary, then these difficulties can be obviated. However, this approach is slow and inefficient for clinical trials and may not be practical in the clinic.



FIGURE 2. Unaltered Spectralis (A) and Cirrus (B) SD-OCT thickness maps before ETDRS grid adjustment (C, D).

In the present study, a fully automatic segmentation program, the Duke Optical Coherence Tomography Retinal Analysis Program (DOCTRAP) software, was used to segment the retina, RPE, and Bruch's membrane and to calculate retinal thickness on images acquired from eyes with DME by two different SD-OCT systems (Cirrus and Spectralis). We also assessed whether the automatically generated retinal layer thickness values produced by DOCTRAP match corresponding values attained by automatic and manually corrected semi-automatic segmentation using the Spectralis and Cirrus native software.

METHODS

Study Dataset

SD-OCT images of eyes from subjects with DME enrolled in a randomized prospective DME clinical trial were evaluated. The Duke University Review Board approved this study, which adhered to the tenets of the Declaration of Helsinki. Informed consent was obtained from all participants.

Volumetric scans were acquired using two SD-OCT imaging systems, Spectralis with Spectralis Viewing Module (Version 5.3.0.15) and Cirrus HD-OCT with review software (Version 5.2.0.210). For images obtained by Spectralis SD-OCT, a custom $20^{\circ} \times 20^{\circ}$ volume acquisition protocol was used to obtain one set of high-speed scans from each eye. With this protocol, 49 cross-sectional B-scan images were obtained, each composed of 512 A-scans. For images obtained by Cirrus HD-OCT, the 512 \times 128 Macular Cube scan protocol was used. With this protocol, 128 cross-sectional B-scan images were obtained, each composed of 512 A-scans.

A Duke Reading Center-certified reader determined scan quality. Readers classified image quality as *bigb* or *low* based on our previously published criteria.⁹ For example, images that were well saturated, well resolved, and free of artifacts were deemed high quality; images with low resolution, low saturation, or with artifacts produced by eye motion or loss of fixation were denoted low-quality images. We then randomly selected 40 subjects (20 imaged by Spectralis and 20 imaged by Cirrus) with high-quality images to validate the segmentation algorithm.



FIGURE 3. Automatic segmentation flow chart to segment Spectralis and Cirrus SD-OCT images of eyes with DME.

Guidelines for Retinal Layer Identification on Images With DME

Prior to any manual segmentation and algorithm development, we constructed a set of qualitative guidelines based on previous literature, expertise from the Duke Reading Center, and representative images to identify layer boundaries on images with DME. These guidelines were established to maintain a consistent and unbiased interpretation of each retinal boundary and are as follows:

- 1. The retina/RPE thickness was defined as the region of tissue between the inner limiting membrane (ILM) and the outer RPE boundary for both Spectralis and Cirrus images (Figs. 1A, 1D);
- 2. On images acquired by Spectralis, the retinal thickness was defined as the region of tissue between the ILM and the inner RPE boundary (Fig. 1B); and
- 3. On images acquired by Cirrus, the retinal thickness was defined as the region of tissue between the ILM and a position just external to the inner RPE boundary. This definition was used because the Cirrus software segments the outer boundary at this location rather than at the inner RPE boundary (Fig. 1C).

Automatic Segmentation and Manual Correction by Commercial Software

Using the automatic software algorithms corresponding to each OCT system, the Spectralis system segmented the retina/ RPE, and the Cirrus system segmented the retina (Figs. 1A, 1C). Both systems generated topographic surface maps for each patient as defined by the ETDRS. In cases where the image was not centered within the grid, the grid was moved manually with the system software to center the images (Fig. 2). Based on automatic segmentation, the Spectralis software determined average retina/RPE thickness measurements, and the Cirrus software calculated retinal thickness values, for each of five ETDRS grid map sectors: the center 1 mm, and the superior, inferior, nasal, and temporal sectors extending 3 mm from the center of the ETDRS map.

To correct for errors in the Spectralis and Cirrus software segmentation, a Duke Reading Center-certified reader manually adjusted retinal layer boundary positions using the respective system's software. Using the manually corrected segmentation, thickness measurements were redetermined.

The outer segmentation lines were also manually adjusted by readers to the inner aspect of the RPE on Spectralis and to the outer aspect of the RPE/Bruch's membrane on Cirrus to provide thickness data that could be compared with the DOCTRAP fully automatic software, using two different common reference boundaries (Figs. 1B, 1D).

Automatic Segmentation by DOCTRAP Software

All 49 B-scans from each subject imaged on the Spectralis system were exported as bitmap files, and all 128 B-scans from each subject imaged on the Cirrus system were exported as IMG files. Cirrus IMG files were then converted to bitmap files using MATLAB (Mathworks, Natick, MA). We then used the DOCTRAP automatic segmentation software to segment the ILM and the inner and outer RPE boundaries on the bitmap images. Unlike the commercial software segmentation results, no manual correction was performed to alter the fully automatic lines output by DOCTRAP.



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TABLE 1.

Retina/RPE Thickness

	R	dean Thickness, μ	ш	DOCTRAP Softw	are vs. Spectralis Auto	omatic Software	DOCTRAP So	oftware vs. Spectralis S Manual Correction	oftware With
	DOCTRAP Automatic Software, Mean ± SD*	Spectralis Automatic 1 Software, Mean ± SD*	Spectralis Software With Manual Correction, Mean ± SD*	Mean Paired Difference, Mean ± SE	ICC (95% CI)	95% Limits of Agreement	Mean Paired Difference, Mean ± SE	ICC (95% CI)	95% Limits of Agreement
1-mm diameter									
central fove:	al								
area	463.8 ± 107.3	467.0 ± 108.1	467.2 ± 109.3	-3.22 ± 1.14	(666.0-266.0) 666.0	-5.61 to -0.82	-3.42 ± 0.67	1.000 (0.999-1.000)	-4.83 to -2.01
Surrounding and	ea, out to 3 mm								
Superior	444.1 ± 90.3	442.9 ± 88.6	442.9 ± 89.2	1.25 ± 1.37	0.998 (0.994-0.999)	1.20 to 1.32	1.20 ± 1.32	0.998 (0.995-0.999)	-1.33 to 2.28
Nasal	420.7 ± 68.7	418.3 ± 66.6	418.9 ± 67.5	2.36 ± 1.66	0.994 (0.985-0.998)	1.81 to 1.58	$1.81~\pm~1.58$	0.995 (0.986-0.998)	1.85 to 9.63
Inferior	410.1 ± 63.7	406.5 ± 59.2	405.9 ± 59.8	3.71 ± 1.66	0.993 (0.982-0.997)	4.26 to 1.60	4.26 ± 1.60	0.993 (0.983-0.997)	6.92 to 16.2
Temporal	456.9 ± 103.9	457.0 ± 102.7	455.7 ± 103.1	-0.08 ± 1.62	0.998 (0.994-0.999)	1.22 to 1.65	1.22 ± 1.65	0.997 (0.994-0.999)	2.15 to 8.94
CI, confider $* n = 20$.	nce interval.								

TABLE 2. Mean Retinal Thickness Determined by DOCTRAP Automatic Software and Spectralis Semi-Automatic Software (Manual Placement of Inner RPE Boundary)

			Retinal Thickness		
	Mean Th	uickness, µm	DOCTRAP Automatic Soft	tware vs. Spectralis Semi-Auto	matic Software
	DOCTRAP Automatic Software, Mean ± SD*	Spectralis Semi-Automatic Software, Mean \pm SD*	Mean Paired Difference, Mean ± SE	ICC (95% CI)	95% Limits of Agreement
1-mm diameter central foveal area Surrounding area, out to 3 mm	441.9 ± 107.9	443.9 ± 108.6	-2.02 ± 1.35	0.998 (0.996-0.9999)	-4.84 to 0.80
Superior	424.3 ± 90.1	422.3 ± 88.1	1.99 ± 1.53	0.997 (0.993-0.999)	-1.21 to 5.19
Nasal	399.0 ± 68.8	396.4 ± 66.1	2.64 ± 1.79	0.993 (0.982-0.997)	-1.12 to 6.39
Inferior	389.3 ± 63.3	385.2 ± 58.5	4.14 ± 2.20	0.987 (0.967-0.995)	-0.45 to 8.74
Temporal	436.4 ± 103.9	435.5 ± 102.7	$0.87~\pm~1.50$	0.998 (0.995-0.999)	-2.26 to 4.01
$n^* n = 20.$					

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ullv	Automatic	SD-OCT	Retinal	Thickness	Software	in	DMF

-4.67 to 0.18 -3.77 to 2.81 -1.57 to 8.84

1.000 (0.999-1.000) 0.999 (0.997-1.000) 0.998 (0.995-0.999) (0.993-0.999) 0.999 (0.997-1.000)

 -2.24 ± 1.16

-5.30 to 1.61

0.999 (0.998-1.000)

 -1.84 ± 1.65

 442.5 ± 182.9

 442.7 ± 182.4

 440.8 ± 183.4

-3.25 to 4.18

-2.80 to 4.23

0.997

 3.63 ± 2.49

 0.71 ± 1.68

 0.46 ± 1.78

 -0.48 ± 1.57

-21.80 to 60.75

0.734 (0.441-0.886) 0.998 (0.996-0.999) 0.998 (0.995-0.999)

 19.47 ± 19.72

 411.2 ± 139.9

 408.7 ± 128.2

 $\begin{array}{l} 391.3 \pm 139.9 \\ 408.6 \pm 128.3 \end{array}$ 402.6 ± 142.8

 410.7 ± 142.7 409.2 ± 131.5

Surrounding area, out to 3 mm

Superior

1-mm diameter central

foveal area

 405.4 ± 148.6 416.2 ± 170.3

Temporal

Inferior Nasal

* n = 20

 ± 1.70 2.83 ± 2.10 5.16 ± 4.16

0.61

 ± 141.0

401.8 415.5

 ± 165.7

 411.0 ± 154.7

-2.94 to 4.17

-1.57 to 7.24 -3.55 to 13.9

0.993 (0.984-0.997)

95% Limits of

Cirrus Manual Correction

Cirrus Automatic Software

DOCTRAP Software vs. **Retinal Thickness**

DOCTRAP Software vs.

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ICC (95% CI)

Mean Paired

Difference, Mean ± SE

95% Limits of

Agreement

ICC (95% CI)

Mean \pm SE Difference,

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Mean \pm SD^{*} Automatic Software, Cirrus

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Cirrus Software With Manual

DOCTRAP

Mean Thickness, µm

Our new three-retinal layer boundary segmentation algorithm for SD-OCT images with DME was developed based on the generalized graph theory and dynamic programming framework that we previously introduced for a normal retina and eyes with drusen and geographic atrophy secondary to nonneovascular AMD.9,10 In these previous publications, images were acquired by the Bioptigen SD-OCT system (Bioptigen, Inc., Research Triangle Park, NC). An outline of the new algorithm flow is shown in Figure 3, and the key components needed to adapt this method for Spectralis and Cirrus images of eyes with macular edema are described below. In this study, the same DOCTRAP implementation and corresponding parameters were used for all SD-OCT images captured with a given SD-OCT system, Cirrus or Spectralis.

First, instead of flattening the retinal structures based on the convex hull of the estimated inner retinal pigment epithelium and drusen complex (RPEDC) boundary,9,10 the image was flattened based on a pilot estimate of Bruch's membrane. We fitted the pilot estimate of Bruch's membrane to both a second- and third-order polynomial, and the polynomial with the lower norm of residuals was used to flatten the image. Second, the graph weights were changed; we segmented Bruch's membrane using a combination of gradient, intensity, and distance weights, and the inner RPE was segmented using only gradient weights. These weights were fixed for all images of all patients captured by both the Spectralis and Cirrus systems. Third, we utilized the lateral (horizontal) and axial (vertical) pixel resolutions imported from the Spectralis and Cirrus systems so that the algorithm could segment images of any resolution. This allowed us to apply the exact same algorithm to segment both Spectralis and Cirrus images.

Comparison of DOCTRAP and Commercial Software Segmentation

To demonstrate that the automatic DOCTRAP software was able to accurately match the segmentation output by both the Spectralis and Cirrus software, we compared the following for all patients:

- 1. Average retina/RPE thickness generated automatically by DOCTRAP and Spectralis (with and without manual correction of Spectralis segmentation lines);
- 2. Average retinal thickness generated automatically by DOCTRAP and semi-automatically (manual placement of the inner RPE boundary) by Spectralis;
- 3. Average retinal thickness generated automatically by DOCTRAP and Cirrus (with and without manual correction of Cirrus segmentation lines); and
- 4. Average retina/RPE thickness generated automatically by DOCTRAP and semi-automatically (manual placement of the outer RPE/Bruch's membrane boundary) by Cirrus.

We reported these average thickness values for five of nine ETDRS sectors, including the center 1 mm and the superior, temporal, inferior, and nasal areas within the inner circle.

This analysis revealed that there was a constant offset in the position of the segmented inner and outer RPE boundaries when comparing DOCTRAP with the Spectralis and Cirrus software. To adjust for these differences, the DOCTRAP inner RPE line was adjusted 1 pixel externally and the DOCTRAP outer RPE line was adjusted 1 pixel internally to correspond to the segmentation lines placed by the Spectralis software. Similarly, when comparing the DOCTRAP segmentation lines with those placed by the Cirrus software, we adjusted the

 TABLE 4.
 Mean Retina/RPE Thickness Determined by DOCTRAP Automatic Software and Cirrus Semi-Automatic Software (Manual Placement of Outer RPE/Bruch's Membrane Boundary)

			Outer Retina		
	Mean Th	ickness, µm	DO0 Cir	CTRAP Automatic Softwa rus Semi-Automatic Sof	are vs. tware
	DOCTRAP Automatic Software, Mean ± SD*	Cirrus Semi-Automatic Software, Mean ± SD*	Mean Paired Difference, Mean ± SE	ICC (95% CI)	95% Limits of Agreement
1-mm diameter central foveal area	459.0 ± 183.8	463 ± 184.8	-4.05 ± 1.45	0.999 (0.998-1.000)	-7.08 to -1.01
Surrounding area, out to 3 mm					
Superior	428.9 ± 143.5	428.9 ± 140.6	0.00 ± 1.72	0.999 (0.996-0.999)	-3.61 to 1.72
Nasal	428.1 ± 131.7	428.3 ± 127.9	-0.19 ± 2.61	0.996 (0.990-0.998)	-5.66 to 5.28
Inferior	423.2 ± 148.8	420.8 ± 141.2	2.44 ± 2.86	0.996 (0.990-0.998)	-3.56 to 8.43
Temporal	434.4 ± 171.0	435.0 ± 168.2	-0.62 ± 1.74	0.999 (0.997-1.000)	-4.26 to 3.03

* n = 20.

DOCTRAP inner RPE line 5 pixels externally and we adjusted the DOCTRAP outer RPE line 1 pixel externally.

Statistical Analysis

Statistical analysis was performed using JMP 9.0.0 (SAS Institute, Cary, NC) and IBM SPSS Statistics 20 (SPSS, Inc., Chicago, IL). The intraclass correlation (ICC) was used to determine agreement between retinal thickness measurements obtained by DOCTRAP and Spectralis software, and between DOCTRAP and Cirrus software. Bland-Altman plots with 95% limits of agreement for each comparison were determined to evaluate whether differences in thickness measurements in the different regions depended on the magnitude of the measured thickness.

RESULTS

Spectralis

Automatic segmentation by DOCTRAP and Spectralis software is shown in Figures 4A and 4C. The retina/RPE thickness measurements determined automatically by DOCTRAP, automatically by Spectralis software, and by Spectralis software with manual correction were all very similar to one another. Tables 1 and 2 show the mean retina/RPE thickness for the 1mm diameter central foveal area and the surrounding innermost superior, nasal, inferior, and temporal regions on the ETDRS grid. The mean retina/RPE thickness of the 1-mm diameter central foveal subfield was $463.8 \pm 107.5 \ \mu\text{m}, 467.0$ \pm 108.1 µm, and 467.2 \pm 109.3 µm as determined by the DOCTRAP automatic segmentation software, Spectralis automatic segmentation software, and Spectralis software with manual correction, respectively. There was also a high degree of agreement for the mean thickness in the surrounding quadrants determined by both software products (Table 1).

We next determined mean retinal thickness measurements after repositioning the outer Spectralis segmentation line to the inner aspect of the RPE. With this segmentation line placement, the mean 1-mm diameter central foveal subfield retinal thickness determined by DOCTRAP and Spectralis software also agreed with one another; the mean paired difference was $-2.02 \pm 1.35 \mu m$ (ICC, 0.998). There was also good agreement for the mean retinal thickness in the surrounding superior, nasal, inferior, and temporal quadrants (Table 2).

Cirrus

Automatic segmentation by DOCTRAP and Cirrus software is shown in Figures 4B and 4D. The retinal thickness measurements determined automatically by DOCTRAP, automatically by Cirrus software, and by Cirrus software with manual correction were all very similar to one another. The mean 1mm diameter central foveal subfield retinal thickness was 440.8 \pm 183.4 $\mu m,$ 442.7 \pm 182.4 $\mu m,$ and 442.5 \pm 182.9 μm as determined by the DOCTRAP automatic segmentation software, Cirrus automatic segmentation software, and Cirrus software with manual correction, respectively. Furthermore, the mean retinal thicknesses of the regions surrounding the central subfield out to 3 mm were all similar to one another except for the superior region, which was more variable (ICC for all regions except the superior region, 0.993-0.999). In the superior region, the average difference between the automatic Cirrus measurements and automatic DOCTRAP measurements was 19.47 µm (ICC, 0.734) (Table 3).

We next determined mean retina/RPE thickness measurements after repositioning the outer Cirrus segmentation line to the outer RPE/Bruch's membrane. With this segmentation line placement, the mean 1-mm diameter central foveal subfield retina/RPE thickness determined by DOCTRAP and Cirrus software was comparable clinically. The mean paired difference was $-4.05 \pm 1.45 \mu$ m (ICC, 0.999). There was also good agreement for the mean retina/RPE thickness in the surrounding superior, nasal, inferior, and temporal quadrants (ICC, 0.996-0.999; Table 4).

DISCUSSION

In the present report, we have shown that the DOCTRAP automatic segmentation software can readily import universal image files (bitmap images) exported from two different SD-OCT systems and can identify specific inner and outer retinal layer boundaries in the central subfield and surrounding regions in eyes with DME. From the segmentation lines placed on these boundaries, retina/RPE and retinal thickness measurements were calculated automatically with this novel software. These measurements agreed well with those determined by commercially available software from two different manufacturers. Furthermore, there were no reproducible systematic thickness differences as a function of retinal thickness magnitude.



FIGURE 5. An example segmentation error produced by the Cirrus software. (A) Erroneous outer segmentation *line* results in an erroneous mean retinal thickness measurement of 473 μ m in superior surrounding area. (B) Accurate outer segmentation *line* after manual correction results in a mean retinal thickness of 873 μ m. (C) Accurate outer segmentation *line* placed automatically by DOCTRAP software.

The thickness measurements were similar for all DOCTRAP and Spectralis and all DOCTRAP and Cirrus software comparisons, with the exception of the superior region surrounding the central subfield in the DOCTRAP-Cirrus retinal thickness comparison. This difference in the superior subfield was likely caused by significant errors in the Cirrus automated segmentation for one of the subjects (Fig. 5), as after manual correction of these errors, the mean retinal thicknesses determined by DOCTRAP and Cirrus software were nearly identical (ICC, 0.999; Table 3).

We, and others, have previously published the SD-OCT segmentation artifact rates in eyes with a variety of diseases, including those with diabetic macular edema. In this study, we randomly selected high-quality images for analysis to validate the segmentation algorithm. Accordingly, fewer segmentation line algorithm failures were observed than what would typically be seen in practice (with the exception of the error observed in one patient and illustrated in Fig. 5). In the future, it will be valuable to compare segmentation error rates in DOCTRAP with those produced by commercially available software. To conduct an appropriately detailed segmentationerror analysis is beyond the current study scope but is the subject of work currently in progress at our institution.

We specifically analyzed eyes with DME in this study; however, macular edema caused by other diseases such as retinal vein occlusion, uveitis, and neovascular AMD can also be assessed quantitatively with OCT¹¹; thus we anticipate that our automatic software will be similarly useful in determining retinal thickness in eyes with other macular edema-related conditions. It will be of interest to apply our DOCTRAP segmentation analysis to eyes with macular edema from these various conditions.

In our previous studies, we showed that the DOCTRAP segmentation software could automatically segment the ILM, retinal nerve fiber layer, ganglion cell complex, external limiting membrane, inner segment/outer segment (IS/OS) junction, inner RPE, and Bruch's membrane in normal eves and in eyes with dry AMD.9,10,12 In the present report, we used DOCTRAP to automatically segment the ILM and the inner and outer RPE boundaries to calculate the mean retina/RPE and retinal thickness in each ETDRS grid area in eyes with DME. Thickness abnormalities of the retinal nerve fiber layer and ganglion cell complex have been associated with visual function deficits in eyes with optic neuropathies such as optic neuritis, while abnormal external membrane and ellipsoid zone integrity, as well as abnormal thickness in the outer nuclear complex layer, have been associated with decreased visual acuity. An assessment of these layers in eyes with pathology is beyond the current scope of our study. However, studies to assess these boundary layers in eyes with diabetic macular edema and other retinal diseases are currently underway at our Reading Center.

This study has limitations. We selected relatively highquality images, which facilitated the identification of retinal boundaries. In a clinical setting, factors may decrease the ability to identify layer boundaries. For example, media opacity or patient eye movement could degrade images and compromise the automatic segmentation accuracy.^{5,13,14} The relative ability of our automatic software and the commercially available software to segment boundaries under these adverse conditions remains to be determined. Another limitation is that different patients were imaged on different systems. We are now collecting data whereby the same subject is imaged on both systems during the same imaging session so that we may directly compare thickness measurements obtained by the two different systems.

Analysis of retina/RPE and retinal thickness was determined for eyes with DME using images obtained by two commonly used OCT systems, Spectralis and Cirrus. The performance of our DOCTRAP software on other SD-OCT systems is not yet known. Regardless, the results which show a high degree of agreement for thickness determined by commercial software and by DOCTRAP software, when applied to different common outer layer boundary lines, are encouraging; these data suggest that DOCTRAP software may be useful to compare retinal thickness in eyes with DME across OCT platforms in the clinic and in interventional and natural history trials.

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