



Advantages of Widefield Optical Coherence Tomography in the Diagnosis of Retinopathy of Prematurity

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Nguyen TTP, Ni S, Khan S, Wei X, Ostmo S, Chiang MF, Jia Y, Huang D, Jian Y and Campbell JP (2022) Advantages of Widefield Optical Coherence Tomography in the Diagnosis of Retinopathy of Prematurity. Front. Pediatr. 9:797684. doi: 10.3389/fped.2021.797684 Recent advances in portable optical coherence tomography (OCT) and OCT angiography (OCTA) have resulted in wider fields of view (FOV) and shorter capture times, further expanding the potential clinical role of OCT technology in the diagnosis and management of retinopathy of prematurity (ROP). Using a prototype, handheld OCT device, retinal imaging was obtained in non-sedated infants in the neonatal intensive care unit (NICU) as well as sedated infants in the operating room of Oregon Health & Science University (OHSU) Hospital. In this observational study, we provide an overview of potential advantages of OCT-based disease assessment in ROP. We observed that next-generation OCT imaging (a) may be sufficient for objective diagnosis and zone/stage/plus disease progression and post-treatment course, (c) provides three-dimensional mapping of the vitreoretinal interface, and (d) with OCTA, enables dye-free visualization of normal and pathologic vascular development.

Keywords: retinopathy of prematurity, pediatric retina, optical coherence tomography, handheld optical coherence tomography, optical coherence tomography with angiography

INTRODUCTION

Optical coherence tomography (OCT) and OCT angiography (OCTA) are widely used to evaluate patients with diseases of the macula and vitreoretinal interface. Over the last two decades, the diagnosis and management of both leading causes of blindness in adults (diabetic retinopathy and age-related macular degeneration) have incorporated OCT into the standard of care. Applications in pediatric retinal diseases, such as retinopathy of prematurity (ROP), have been more challenging due to the difficulty of imaging children using devices designed for adults, both in terms of positioning requirements of adult table-mounted devices as well as the need for patient cooperation to prevent motion artifacts. Recent advancements in OCT technology have made image acquisition feasible for use in awake infants and have the potential to improve our management of many diseases in pediatric retina, including ROP, by allowing for objective diagnosis and sensitive detection of anatomical changes.

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Previous ROP studies incorporating OCT technology have largely directed attention at the diagnostic value of macular and posterior retinal changes due to practical FOV limitations. These efforts have broadly fallen into two categories: detection of subclinical pathology and evaluating objective biomarkers of disease. We have learned that OCT can demonstrate retinoschisis (1) and early vitreoretinal traction (2) better than our eyes can appreciate during the clinical examination, that cystoid macular changes can occur in ROP (3, 4) as in other retinal vascular diseases, and that the changes associated with plus disease cause three-dimensional architectural changes in the retina (5), including at the vascular-avascular border (6, 7). There has also been increased attention on the sequelae of blood retinal barrier disruption, with an increase in vitreous opacities seen in more severe ROP (8). Recent papers have focused on normal and abnormal foveal development in prematurity (9, 10), previously impossible to evaluate in vivo, as well as the repeatability and reproducibility of measurements taken with a handheld OCT device (11).

Over the last 10 years there has been a transition toward faster laser speeds using swept-source (SS-OCT) designs in handheld OCT prototypes, which has enabled faster image acquisition and OCTA (12–14). With OCT in general, there is a tradeoff between signal quality, imaging speed, and FOV. In the pediatric population, since imaging non-sedated infants necessitates fast imaging speed to prevent motion artifacts, the tradeoff is between signal quality and FOV. For OCTA, this reality means that given current imaging speeds, OCTA can be obtained at small FOVs but motion artifact becomes significant as FOV is expanded. Image segmentation also remains a challenging barrier, especially given motion artifact, and has thus far prevented validation of quantitative OCTA biomarkers in neonates.

We previously described a widefield, handheld SS-OCT device with a $>55^{\circ}$ FOV, that was capable of visualizing peripheral pathology when coupled with scleral depression (15). Subsequently, we have re-engineered the FOV to approximately 105° in a new design, which can provide real-time *en face* visualization that can be used to optimize the image quality and orientation prior to image acquisition, which takes 1.5 s. (16) Our experience operating this device in the NICU has provided a number of observations as to how advances in OCT technology may provide value to patient care in the future. In this paper, we review the potential advantages of using widefield OCT in the diagnosis and management of ROP.

METHODS

This study was approved by the Institutional Review Board (IRB) at Oregon Health & Science University (OHSU) and adheres to all tenets of the Declaration of Helsinki. Infants were eligible for recruitment if they met criteria for ROP screening (birthweight $\leq 1,500$ g or gestational age ≤ 30 weeks). Exams were performed at the bedside with an eyelid speculum, after administration of cyclomydril and proparacaine. Consent for imaging was obtained from parents. Between March and November 2021, we performed more than 200 eye examinations with OCT. Infants



FIGURE 1 Portable handheld OCT device. Upper-left image shows the prototype device with OCT module and computer. Upper-right image shows a close-up of the probe with a 5.5-inch display capable of real-time *en face* visualization. Bottom image shows the imaging process of an infant in the neonatal intensive care unit.

were imaged with a 400-kHz portable handheld SS-OCT system with a modular lens system as shown in **Figure 1**, providing up to a 105° FOV. The camera was held by the examining ophthalmologist and a second person controls the software.

Our investigational system features real-time *en face* visualization to allow the operator visual feedback of the scanning region. OCT volumes were averaged in linear scale, and processed using custom software to create mean-intensity *en face* projections. B-scans were processed using an image registration algorithm. This enables the OCT to be used as a fundus camera for visualization of peripheral ROP stage even prior to acquisition of the OCT volumes. Image acquisition takes 1.5 s.

In post-processing, three-dimensional rendering was completed in the Volume Viewer plugin of Fiji, a distribution of ImageJ (17). Segmentation of OCT volumes was performed manually with the Insight Toolkit (18), then interpolated and applied to volumes using custom software coded in MATLAB (19). OCTA images were generated using a novel phase-stabilized complex-decorrelation methodology (20), with automated segmentation performed using a guided bidirectional graph search method (21), both of which were designed specifically for use in swept-source, widefield applications.

RESULTS

Objective Diagnosis/Documentation

We found that real-time *en face* visualization allows handheld OCT to be used much like an ophthalmoscope, with a



comparable FOV and improved contrast when visualizing the border between vascular and avascular retina. Since visualization of peripheral stage typically requires scleral depression, we evaluated whether scleral depression, coupled with the handheld OCT could detect and visualize peripheral stage. Figure 2 demonstrates posterior and peripheral images obtained using this method, using both 55° and 105° FOV devices. In most cases, it was possible to objectively assess the degree of peripheral stage. The cases where we were unable to visualize the retinal periphery using OCT were also the most challenging to examine ophthalmoscopically. These included babies with swollen eyelids due to continuous positive airway pressure (CPAP), and those who were unstable clinically, where we prioritized the clinical standard ophthalmoscopic examination to rule out clinically significant disease but otherwise kept the examination as brief as possible to minimize any added stress and risk from research imaging. That said, in those most challenging cases where we were able to obtain OCT imaging, we often found that en face OCT provided better sensitivity for detection of subtle changes at the vascular-avascular border, although this was not performed in a masked fashion.

55° system. White arrows indicate the indentation of the scleral depressor.

Monitoring of Disease Progression and Regression

Serial evaluation of fundus photos has demonstrated value in detecting signs of disease progression (22). We found that *en*

face visualization provided sufficient detail to assess relative changes in disease severity across time (**Figure 3A**) by direct comparison to prior images. Additionally, when evaluating the effect of treatment with intravitreal bevacizumab, we found that direct comparison of the *en face* OCT of the posterior pole and retinal periphery demonstrated reduction in the stage and extent of peripheral disease as well as the degree of plus disease (**Figure 3B**).

Vitreoretinal Interface and Retinal Detachment

A major advantage of OCT over the ophthalmoscopic examination in vitreoretinal disease management is the ability to determine three-dimensional relationships between the vitreous, the retina, and extraretinal membranes. While these relationships are visible with smaller FOV systems, it takes far more time to visualize the entire periphery with multiple scans. With the 105° FOV system, we can capture both the posterior pole and retinal mid-periphery in a single image, allowing for three-dimensional reconstruction of the topographical anatomy of the retina and vitreous. **Figure 4A** demonstrates how these three-dimensional relationships can be visualized in the setting of a retinal detachment using cross-sectional B-scans. Additionally, three-dimensional rendering provides another means of interactive visualization, which may aid surgical planning (**Figure 4B**).

Using the 55° and 105° FOV systems, we imaged patients with a broad range of peripheral stage, as shown in **Figures 3**, **5**. Note that eyes can have differences both in the degree and extent of peripheral stage as well as the degree of dilation and tortuosity of the posterior retinal vessels. B-scans drawn along the length of the vascular-avascular junction demonstrate three-dimensional retinal changes (**Figure 5A**) and could one day be a more precise and continuous biomarker for disease severity in an eye than "maximum stage," which the current classification system recommends. OCT also aids in the diagnosis of popcorn neovascularization, considered in the spectrum of stage 2 ROP, and can show how extraretinal fibrovascular proliferation coalesces into the typical stage 3 lesion appearance (**Figures 3**, **5**).

Optical Coherence Tomography Angiography

Figure 6 shows OCTA *en face* projections obtained with the widefield OCT device. With OCTA, there is a tradeoff between FOV and motion artifact as seen in the example. In the future, this may be reduced by using a smaller FOV, with a faster laser, or with improved software. Nonetheless, these results demonstrate the potential for non-invasive angiographic visualization of non-perfusion and neovascularization, both of which may be quantifiable biomarkers in the future.

DISCUSSION

Advances in the speed and optical engineering of OCT devices have made the incorporation of OCT into ROP diagnosis



more practical. In this paper, we describe key potential advantages of widefield OCT in the diagnosis and management of ROP.

Widefield imaging using OCT has the potential to provide quantitative and objective assessment of each of the components of ROP classification. The diagnosis of ROP has always been subjective and qualitative, with the clinician responsible for determining the zone, stage, and presence of plus disease. Yet each of these components represents an ordinal categorization of a continuous spectrum that could be measured more discretely using OCT. Zone represents the area of vascularized retina, which could in theory be measured as an area using en face OCT given the high contrast possible on OCT images. As shown in Figure 3A, stage represents a continuous spectrum that slowly evolves over time until it is eventually treated, or spontaneously regresses (23). In the future, it may be feasible to automatically segment the peripheral vascular-avascular junction and quantify thickness to create objective cutoffs for stage that correlate with population-derived treatment thresholds. Finally, the spectrum of plus disease has been well-described, and may be more objectively quantified using artificial intelligence-derived metrics (24).

Previous work has demonstrated that there is a relationship between plus disease severity on a posterior pole photograph, the zone of disease, and the degree and number of clock hours of peripheral stage in an eye on ophthalmoscopy (24). Widefield OCT has the potential to directly visualize these relationships and provide rapid, non-invasive assessment of ROP severity. Each of these biomarkers may be followed over time to directly assess disease progression (25) or regression (23). This has implications not only for improved clinical care, but also for research as it has not previously been possible to directly measure the continued growth of the retinal vasculature in vivo, and the changes associated with the development of pathologic neovascularization. The natural course and response to treatment of ROP can be followed longitudinally with more frequent imaging, which may allow for earlier detection of changes and correspondingly reduce the time to treatment.

The advantage of widefield OCT over fundus photography is even greater for eyes with moderate or severe ROP where



the topographic changes in the vitreoretinal interface are more dramatic. In our experience, these changes are easier to appreciate using OCT, especially as stage 2 with popcorn neovascularization develops. These lesions often coalesce into typical stage 3 appearance (as in Figures 3, 5). Technically, the distinction between stage 2 and stage 3 is when "extraretinal" neovascularization develops, but practically, the diagnosis is clinical and based on the ophthalmoscopic appearance, since popcorn neovascularization represents extraretinal neovascularization. This is a great example of how OCT and OCTA could lead to more precise classifications of ROP stage in the future, since the transition when neovascularization breaks through the inner limiting membrane (ILM), which can be observed ex vivo on histology (6), but not in vivo, is a critical turning point in the risk of retinal detachment and blindness. Previous work has highlighted the significance of vitreous opacities, which are presumably signs of exudation from breakdown of the blood-retinal barrier secondary to vascular endothelial cell dysfunction (8). Being able to directly evaluate the three-dimensional anatomy of the peripheral retina, as well as the vitreous, may help determine whether these findings are simply a surrogate marker of ROP severity, or independent prognostically. Finally, the use of OCT for early detection and diagnosis of retinal detachment could dramatically reduce the likelihood of blindness.

Since OCT is far more sensitive for the detection of early vitreoretinal traction, it is hard to imagine that with appropriate follow-up, extensive stage 3 and early stage 4 ROP would be missed.

As OCTA technology advances, additional biomarkers relating to avascular zones or neovascular flow may be discovered and incorporated into clinical care. Fluorescein angiography (FA) has been shown to increase sensitivity of ROP screening and improve inter-observer agreement regarding classification (26). OCTA provides an alternative to FA that does not require intravenous contrast. Perhaps the most significant impact of widefield OCT in the evaluation of premature babies is what we have yet to discover. In adults, OCT is increasingly being used to predict the presence of systemic disease, in particular neurological and cardiovascular disease. ROP exists in a larger collection of comorbid diseases with similar etiology, with hyperoxia induced vascular injury in capillary beds throughout the body. Clinically, this is most relevant in the brain, lung, gastrointestinal tract, and kidneys, and it may be that microvascular or structural alterations in the eye, detectable with OCT or OCTA, indicate the presence of comorbid brain or lung disease. Indeed, there is already some indication that this is the case, with recent work demonstrating abnormalities in retinal thickness associated with birthweight, and prior history of sepsis and necrotizing enterocolitis (27).





CONCLUSION

In this paper, we have attempted to argue for the advantages of widefield OCT in the diagnosis and management of ROP. The main limitation of this work is that there are currently no commercially available devices that allow clinicians to incorporate these findings in clinical care, or develop further evidence for the role of OCT in the management of ROP. As this technology continues to improve, and costs come down, we believe that it is a matter of time before faster,



higher resolution, and low-artifact OCTA may produce even more useful biomarkers for *in vivo* assessment of disease. We hope that this work may stimulate others to innovate further and for the added value of this technology to be clearly seen such that commercially available devices may be made available to improve the care of infants at risk for ROP around the world.

DATA AVAILABILITY STATEMENT

The original contributions presented in the study are included in the article/supplementary material, further inquiries can be directed to the corresponding author/s.

ETHICS STATEMENT

The studies involving human participants were reviewed and approved by Oregon Health and Science University Institutional Review Board. Written informed consent to participate in this study was provided by the participants' legal guardian/next of kin. Written informed consent was obtained from the minor(s)' legal guardian/next of kin for the publication of any potentially identifiable images or data included in this article.

AUTHOR CONTRIBUTIONS

JC, MC, DH, YaJ, and YiJ designed the study and obtained the funding. SO developed and maintained the patient database and consented all patients. T-TN, SN, SK, and XW identified, processed, and contributed images to the final paper. All authors provided critical review and approved the final version of the manuscript.

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REFERENCES

- Muni RH, Kohly RP, Charonis AC, Lee TC. Retinoschisis detected with handheld spectral-domain optical coherence tomography in neonates with advanced retinopathy of prematurity. *Arch Ophthalmol.* (2010) 128:57– 62. doi: 10.1001/archophthalmol.2009.361
- Joshi MM, Trese MT, Capone A. Optical coherence tomography findings in stage 4A retinopathy of prematurity: a theory for visual variability. *Ophthalmology.* (2006) 113:657–60. doi: 10.1016/j.ophtha.2006.01.007
- Vinekar A, Avadhani K, Sivakumar M, Mahendradas P, Kurian M, Braganza S, et al. Understanding clinically undetected macular changes in early retinopathy of prematurity on spectral domain optical coherence tomography. *Investig Ophthalmol Visual Sci.* (2011) 52:5183–8. doi: 10.1167/iovs.10-7155
- Erol MK, Ozdemir O, Turgut Coban D, Bilgin AB, Dogan B, Sogutlu Sari E, et al. Macular findings obtained by spectral domain optical coherence tomography in retinopathy of prematurity. *J. Ophthalmol.* (2014) 2014:468653. doi: 10.1155/2014/468653
- Maldonado RS, Yuan E, Tran-Viet D, Rothman AL, Tong AY, Wallace DK, et al. Three-dimensional assessment of vascular and perivascular characteristics in subjects with retinopathy of prematurity. *Ophthalmology*. (2014) 121:1289– 96. doi: 10.1016/j.ophtha.2013.12.004
- Chen X, Mangalesh S, Dandridge A, Tran-Viet D, Wallace DK, Freedman SF, et al. Spectral-domain OCT findings of retinal vascular-avascular junction in infants with retinopathy of prematurity. *Ophthalmol Retina*. (2018) 2:963– 71. doi: 10.1016/j.oret.2018.02.001
- Mangalesh S, Bleicher ID, Chen X, Viehland C, LaRocca F, Izatt JA, et al. Three-dimensional pattern of extraretinal neovascular development in retinopathy of prematurity. *Graefe's Arch Clin Experi Ophthalmol.* (2019) 257:677–88. doi: 10.1007/s00417-019-04274-6
- Legocki AT, Zepeda EM, Gillette TB, Grant LE, Shariff A, Touch P, et al. Vitreous findings by handheld spectral-domain oct correlate with retinopathy of prematurity severity. *Ophthalmol Retina*. (2020) 4:1008– 15. doi: 10.1016/j.oret.2020.03.027
- Maldonado RS, O'Connell RV, Sarin N, Freedman SF, Wallace DK, Cotten CM, et al. Dynamics of human foveal development after premature birth. *Ophthalmology.* (2011) 118:2315–25. doi: 10.1016/j.ophtha.2011.05.028
- Lee H, Proudlock FA, Gottlob I. Pediatric optical coherence tomography in clinical practice-recent progress. *Investig Ophthalmol Visual Sci.* (2016) 57:OCT69–79. doi: 10.1167/iovs.15-18825
- 11. Chen X, Tai V, McGeehan B, Ying G-S, Viehland C, Imperio R, et al. Repeatability and reproducibility of axial and lateral measurements on handheld optical coherence tomography systems compared with tabletop system. *Translational Vision Sci Technol.* (2020) 9:25–25. doi: 10.1167/tvst.9.11.25
- Moshiri Y, Legocki AT, Zhou K, Cabrera MT, Rezaei KA, Tarczy-Hornoch K, et al. Handheld swept-source optical coherence tomography with angiography in awake premature neonates. *Quant Imaging Med Surg.* (2019) 9:1495. doi: 10.21037/qims.2019.09.01
- Campbell JP, Nudleman E, Yang J, Tan O, Chan RP, Chiang MF, et al. Handheld optical coherence tomography angiography and ultra-wide-field optical coherence tomography in retinopathy of prematurity. *JAMA ophthalmology*. (2017) 135:977–981. doi: 10.1001/jamaophthalmol.2017.2481
- Viehland C, Chen X, Tran-Viet D, Jackson-Atogi M, Ortiz P, Waterman G, et al. Ergonomic handheld OCT angiography probe optimized for pediatric and supine imaging. *Biomed Optics Express.* (2019) 10:2623–38. doi: 10.1364/BOE.10.002623
- Scruggs BA, Ni S, Nguyen T-TP, Ostmo S, Chiang MF, Jia Y, et al. Peripheral optical coherence tomography assisted by scleral depression in retinopathy of prematurity. *Ophthalmol Sci.* (2021) 100094. doi: 10.1101/2021.10.14.21265026
- Ni S, Wei X, Ng R, Ostmo S, Chiang MF, Huang D, et al. High-speed and widefield handheld swept-source OCT angiography with a VCSEL light source. *Biomed Optics Express.* (2021) 12:3553–70. doi: 10.1364/BOE.425411

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- Abràmoff MD, Magalhães PJ, Ram SJ. Image processing with ImageJ. Biophotonics Int. (2004) 11:36–42. doi: 10.1201/9781420005615.ax4
- McCormick MM, Liu X, Ibanez L, Jomier J, Marion C. ITK: enabling reproducible research and open science. *Front. Neuroinform.* (2014) 8:13. doi: 10.3389/fninf.2014.00013
- 19. MATLAB and Statistics Release. Natick, MA: The MathWorks, Inc. (2021).
- Wei X, Hormel TT, Jia Y. Phase-stabilized complexdecorrelation angiography. *Biomed Optics Express.* (2021) 12:2419–31. doi: 10.1364/BOE.420503
- Guo Y, Camino A, Zhang M, Wang J, Huang D, Hwang T, et al. Automated segmentation of retinal layer boundaries and capillary plexuses in wide-field optical coherence tomographic angiography. *Biomed Optics Express*. (2018) 9:4429–42. doi: 10.1364/BOE.9.004429
- 22. Rosenblatt TR, Ji MH, Vail D, Ludwig CA, Al-Moujahed A, Pasricha MV, et al. Key factors in a rigorous longitudinal image-based assessment of retinopathy of prematurity. *Sci Rep.* (2021) 11:1–8. doi: 10.1038/s41598-021-84723-7
- Gupta K, Campbell JP, Taylor S, Brown JM, Ostmo S, Chan RP, et al. A quantitative severity scale for retinopathy of prematurity using deep learning to monitor disease regression after treatment. *JAMA Ophthalmol.* (2019) 137:1029–36. doi: 10.1001/jamaophthalmol.2019.2442
- 24. Campbell JP, Kim SJ, Brown JM, Ostmo S, Chan RP, Kalpathy-Cramer J, et al. Evaluation of a deep learning-derived quantitative retinopathy of prematurity severity scale. *Ophthalmology*. (2021) 128:1070–6. doi: 10.1016/j.ophtha.2020.10.025
- Taylor S, Brown JM, Gupta K, Campbell JP, Ostmo S, Chan RP, et al. Monitoring disease progression with a quantitative severity scale for retinopathy of prematurity using deep learning. *JAMA Ophthalmol.* (2019) 137:1022–8. doi: 10.1001/jamaophthalmol.2019.2433
- Klufas MA, Patel SN, Ryan MC, Gupta MP, Jonas KE, Ostmo S, et al. Influence of fluorescein angiography on the diagnosis and management of retinopathy of prematurity. *Ophthalmology.* (2015) 122:1601–8. doi: 10.1016/j.ophtha.2015.04.023
- 27. Shen LL, Mangalesh S, Michalak SM, McGeehan B, Sarin N, Finkle J, et al. Associations between systemic health and retinal nerve fibre layer thickness in preterm infants at 36 weeks postmenstrual age. *Br J Ophthalmol.* (2021). doi: 10.1136/bjophthalmol-2021-319254

Conflict of Interest: Oregon Health & Science University (OHSU), DH, and YaJ have significant financial interests in Optovue, a company that may have a commercial interest in the results of this research and technology. These potential conflicts of interest have been reviewed and managed by OHSU. DH and YaJ have received royalties for patent files through OHSU, as well as loaned equipment for research from Optovue.

The remaining authors declare that the research was conducted in the absence of any commercial or financial relationships that could be construed as a potential conflict of interest.

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