

¹Department of

Ophthalmology, Columbia

University Medical Center,

²F.L. Lizzi Center for

New York, USA

Maryland, USA

⁵Department of

New York, USA

Biomedical Engineering, Riverside Research, New York,

New York, New York, USA

³The Self-Similar Group, LLC,

New York, New York, USA

Washington, Silver Spring,

Ophthalmology, Weill Cornell

Department of Ophthalmology,

Institute, Columbia University

Medical Center, 635 West

Received 18 January 2013

Revised 26 April 2013

Accepted 7 May 2013

Published Online First

5 June 2013

165th Street, New York,

NY 10032, USA;

djceye@gmail.com

Medical College, New York,

Correspondence to

Dr D Jackson Coleman.

Edward S. Harkness Eve

⁴The Retina Group of

Age-related macular degeneration: choroidal ischaemia?

D Jackson Coleman,¹ Ronald H Silverman,^{1,2} Mark J Rondeau,³ Harriet O Lloyd,¹ Aziz A Khanifar.⁴ R V Paul Chan⁵

ABSTRACT

Aim Our aim is to use ultrasound to non-invasively detect differences in choroidal microarchitecture possibly related to ischaemia among normal eyes and those with wet and dry age-related macular degeneration (AMD). **Design** Prospective case series of subjects with dry AMD, wet AMD and age-matched controls.

Methods Digitised 20 MHz B-scan radiofrequency ultrasound data of the region of the macula were segmented to extract the signal from the retina and choroid. This signal was processed by a wavelet transform, and statistical modelling was applied to the wavelet coefficients to examine differences among dry, wet and non-AMD eves. Receiver operating characteristic (ROC) analysis was used to evaluate a multivariate classifier.

Results In the 69 eyes of 52 patients, 18 did not have AMD, 23 had dry AMD and 28 had wet AMD. Multivariate models showed statistically significant differences between groups. Multiclass ROC analysis of the best model showed an excellent volume-under-curve of 0.892±0.17. The classifier is consistent with ischaemia in dry AMD.

Conclusions Wavelet augmented ultrasound is sensitive to the organisational elements of choroidal microarchitecture relating to scatter and fluid tissue boundaries such as seen in ischaemia and inflammation. allowing statistically significant differentiation of dry, wet and non-AMD eyes. This study further supports the association of ischaemia with dry AMD and provides a rationale for treating dry AMD with pharmacological agents to increase choroidal perfusion.

ClinicalTrials.gov registration NCT00277784.

INTRODUCTION

It is well established that macular degeneration is a multifactorial disease related to age, genetics and a host of environmental factors such as light exposure and smoking. Choroidal ischaemia is also well accepted as a causative factor, but its severity and prevalence have not been well documented because of the difficulty in imaging the choroid due to light absorption by the overlying retinal pigment epithelium (RPE).

While reduced function of the RPE and Bruch's membrane are generally regarded as anatomic points of inception of age-related macular degeneration (AMD), the choroid also plays an important role in AMD pathogenesis1 with some investigators, such as Friedman and Oat² and Grunwald and coworkers,³ suggesting a primary role. Significant choroidal vascular alterations, such as changes in choriocapillaris density and volume and choroidal vessel diameter, have been reported both in ageing

and AMD.⁴⁻⁶ Local inflammatory activity in the RPE–Bruch's membrane–choriocapillaris complex has also been described.^{1 7 8} Since these microvascular and regional inflammatory changes are difficult to detect in vivo, clinicians and researchers have sought imaging characteristics predictive of AMD onset or severity. Researchers have used fluorescein angiography, indocyanine green angiography, pulsatile ocular blood flow tonometry and Doppler flowmetry.⁹⁻¹¹ Observed anatomic modifications could be accompanied by or even preceded by localised ischaemia.¹ If microarchitectural choroidal changes that occur concomitantly with early clinical signs of AMD could be detected and documented, then applying early therapy could possibly arrest or interdict AMD progression.

Although advances in optical coherence tomog-raphy (OCT)^{12 13} allow imaging of retinal structures in great detail, adequate visualisation of the choroid has been challenging.14-17 Although enhanced depth imaging (EDI)-OCT can obtain measurements of choroidal thickness, it does not provide data regarding choroidal function. Ultrasonography circumvents the RPE's optical barrier, and while resolution at even as high a frequency as 20 MHz (75 µm axially) is modest in comparison with OCT, ultrasound echo waveforms are affected by the size and spatial distribution of subresolvable scattering elements.18 Regional vascular and other changes in the choroidal interstitium would be expected to significantly alter the reflective interfaces within the ultrasound beam, leading to a complex alteration of the waveform that can be detected using wavelet analysis techniques.

We hypothesise that information from wavelet statistical models may serve as imaging surrogates for vessel diameter, vessel density and extraluminal fluid in the choroid. In this study, our primary objective was to determine if significant differences exist among wavelet parameters of eyes without AMD, with dry AMD and with wet AMD.

METHODS

This study was performed under a protocol approved by the Institutional Review Board of Weill Cornell Medical College. Written informed consent was obtained from the subjects.

This is a prospective case series of 69 eyes of 52 patients. Patients with AMD and age-matched patients without AMD were recruited in an academic retina practice (DIC) for fundus photography, OCT and indocyanine green (ICG) (in some patients) and high-resolution ultrasound in all patients. OCT and rarely ICG were only performed as part of treatment decision-making in wet and dry



To cite: Coleman DJ. Silverman RH, Rondeau MJ, et al. Br J Ophthalmol 2013;97:1020-1023



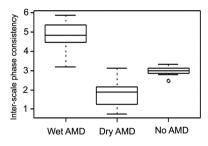


Figure 1 Boxplots showing distribution of interscale phase consistency, a wavelet-derived variable sensitive to fluid vessel wall boundaries, for non-age-related macular degeneration (AMD), dry AMD and wet AMD eyes. The relatively low value of this parameter in dry AMD indicates a reduction in the fluid wall boundaries (ischaemia) and an increase from normal in wet AMD.

AMD, and not at all in the normal group. These data were not used for correlation with wavelet data, but instead were used clinically to aid in confirming the distinction between wet and dry AMD. We performed 20 MHz ultrasound scans on each eye using a B-scan immersion technique with a prototype instrument of our own design. Normal saline was used as the coupling medium, and the eyelids were held open with a Barraquer wire lid speculum. Phase-resolved (radiofrequency) echo data were digitised at a sample rate of 250 MHz with 8-bit precision.

We used a wavelet analysis technique which produces a timefrequency representation of the echo data. This allows addition of the property of shift invariance and gives superior identification of subresolvable information within the waveforms.

The data analysis began with segmentation of the macular retinal–choroidal area from the denoised B-scan^{19 20} using semiautomated methods.²¹ Independent components analysis (ICA) was then performed on echo data from the segmented region to obtain waveforms consisting of speckle and baseband components.²² Wavelet analysis^{23–25} was then applied to the ICA-processed data and summary statistics were calculated.^{26 27} A multivariate statistical technique was then used to identify wavelet coefficients and statistical structures differentiating eyes without AMD from those with dry AMD and those with wet AMD.^{28 29}

RESULTS

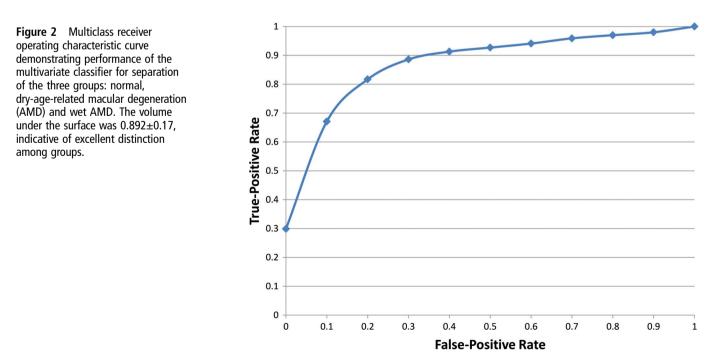
In all, 69 eyes of 52 patients were studied. A total of 18 did not have AMD, 23 had dry AMD and 28 had wet AMD.

The multivariate model showed statistically significant differences for individual wavelet coefficients and wavelet covariance parameters between groups. One measure, interscale phase consistency, a parameter sensitive to tissue interfaces, separated the three subject groups by itself (figure 1). The optimal multivariate model included three wavelet parameters related to persistence and clustering of coefficients between scales and adjacent lateral B-scan line segments as well as the rate that coefficient magnitude decays over the scales. The model demonstrated excellent separation of the three classes and a volume under the multiclass receiver operating surface of 0.892 ± 0.17 (figure 2).^{30 31}

When applied to local echo data, the model can be used to produce wavelet images by performing successive and overlapping wavelet analyses centred on each pixel position using a sliding window. Such synthetic or hybrid ultrasound images show enhancement of contrast between fluid and tissue boundaries due to the differences in microarchitectural properties, as shown in figure 3. We term such images wavelet augmented ultrasound (WAU images) to differentiate them from conventional reflectance amplitude images. In figure 3, the hybrid image is superimposed on an ultrasound mid-band fit backscatter image which enhances boundary planes of the choroid, and like EDI-OCT studies, indicates thinning and irregularity of thickness in dry AMD eyes. These images demonstrate the data from which the interscale phase classifiers were derived.

DISCUSSION

As demonstrated here, WAU tissue characterisation allowed distinction of the dry, wet, and non-AMD choroid. Our methodology used digitised raw ultrasound data³² which differs from standard ultrasound imaging by retaining phase information present in ultrasound waveforms, facilitating both Fourier and Wavelet signal processing. Wavelet analysis is advantageous compared with Fourier analysis as it localises functions in both time and frequency instead of frequency only and adds the property of shift invariance.^{25 33} These properties produce superior



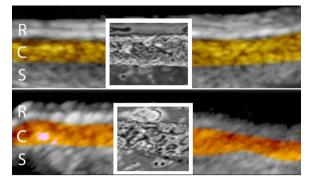


Figure 3 20 MHz ultrasound images of normal (top) and age-related macular degeneration (AMD) (bottom) eyes after semiautomated segmentation of retina (R), choroid (C) and sclera (S) as indicated by coloration. Wavelet processing was applied to the echo data encompassed by boxed regions. Note enhancement of druse in wavelet-processed area of AMD image. The choroid is more irregular in thickness in AMD than in normal eyes, as demonstrated here. These 'hybrid' or wavelet augmented ultrasound images demonstrate the use of classifiers such as interscale phase consistency.

performance compared with Fourier methods in extraction of subresolvable information from echo waveforms.³⁴ We conducted wavelet analysis of 20 MHz ultrasound data to determine and select descriptors most effective in distinguishing between normal eyes and wet and dry forms of AMD. Wavelet parameters were found to have significant classification power and may serve as biomarkers for assessing choroidal change in AMD.

Spectral-domain OCT allows choroidal thickness determination, as does ultrasound,³⁵ and its representation of the choroidal microvasculature such in EDI-OCT¹² is excellent. While OCT can now allow some visualisation of choroidal vasculature, no comparable analysis based on Wavelet or Fourier transforms has to-date been applied to OCT images of the choroid to differentiate wet, dry and non-AMD eyes. The methods described here may be applicable to such data as well. Our technique permits identification of a descriptor or classifier (ie, interscale phase consistency (ISCP)) that allows differentiation of wet, dry and non-AMD eyes based on choroidal ultrasound backscatter.

In dry AMD, the wavelet descriptors showed a reduction in boundary contrast (ie, decreased fluid to tissue ratio) when compared with the normal eye. This indicates choroidal ischaemia in dry AMD. In wet AMD, descriptors showed an increased boundary enhancement which could be caused by an enhanced blood supply or other causes such as inflammation or intrachoroidal microvascular anomalies.³⁶ The ISCP clearly separated the normal, dry AMD and wet AMD eyes in this small series, based on the boundary ratios of fluid and tissue. The dry AMD separation can only be caused by ischaemia. The increased ratio of fluid to tissue in wet AMD could have many causes, including inflammation as suggested by Hageman *et al*⁸ or intrachoroidal microvascular anomalies as suggested by Fukushima *et al*³⁶ and at this time can only be speculative. Future studies may be able to clarify the cause of the increased fluid to tissue ratio in wet AMD.

The genesis of RPE degeneration and choroidal neovascularisation in AMD is multifactorial, and is an open question. Is it primarily genetic or oxidative stress or ageing of the RPE itself or is it thickening of Bruch's membrane? Could all be related to ischaemia in the choriocapillaris and Sattler's layer of small arterioles? While the results of this study may not conclusively answer the question of causation of all AMD, and do not dispute genetics, oxidative stress or other factors, these results do confirm a principal correlation, if not causation, of dry AMD by choroidal dysfunction.

Our hypothesis, based on the results of this study and the findings of other investigators, is that ischaemia, primarily of Sattler's layer of the choroid, exists in all or nearly all cases of dry AMD. This smooth muscle endothelial dysfunction of the terminal arterioles would reduce the production of nitric oxide, a messenger molecule produced by the endothelium of the arterioles and choriocapillaris. This arteriolar damage may in turn be caused by parasympathetic neuronal deterioration³ as in erectile dysfunction and other arteriolar smooth muscle autonomic nerve-related diseases. Reiner and others³⁹⁻⁴² have described the autonomic nerve relationship in the choroid in animal models. Fluid transfer between the choriocapillaris and the interstitial space of the retina would be based on the gradient of hydrostatic and osmotic pressure. Flower and coworkers⁴³ have proposed that fluid transfer into the extracellular space around the RPE and removal of waste products may be governed by Starling's Law. These waste products (eg, drusen) and resultant toxic effects give rise to inflammation,¹¹⁷ vascular endothelial growth factor production and ultimately wet AMD. Our hypothesis would thus support a parasympathetic neuronal control of the terminal arterioles as a causative factor in reduced perfusion of the extracellular region surrounding the RPE. While other causes such as genetic predilection and/or oxidative stress are certainly present, RPE deterioration in AMD could thus be at least partly an effect rather than the sole direct cause of dry AMD, and ultimately wet AMD. The concept of parasympathetic choroidal perfusion regulation would relate pharmacological treatment of choroidal dysfunction to that of erectile dysfunction, another parasympathetic dystrophy for which a rich pharmacological data base is available.

Based on our results of ultrasonographic evidence of choroidal ischaemia in AMD and the results of EDI-OCT,^{44 45} we, like others,^{3 46} feel that pharmacological agents such as sildenafil, tadalafil, niacin or other agents that increase choroidal perfusion could have a beneficial effect on delaying or interdicting AMD. Choroidal perfusion measurements with swept scan ultrasound and OCT measurements of thickness offer a means of measuring and monitoring pharmacological therapy.^{44 45}

Ultimately, longitudinal studies, including swept scan quantitative measurement of choroidal perfusion coupled with OCT, will be required to determine if reversing or moderating choroidal ischaemia will stabilise or interdict AMD. Such studies will also provide increased insight into the sequence of RPE change relative to the other parts of the tunica ruyschiana and more definitively determine not only the role of ischaemia as a primary causative factor of AMD but allow us to determine the role of pharmacological agents that could have a beneficial effect on the development and progression of AMD.

Contributors Design and conduct of the study: DJC, RHS and RVPC; collection, management, analysis, and interpretation of the data: DJC, RHS, MJR, HOL and AAK; and preparation and review of the manuscript: DJC, RHS, MJR and HOL.

Funding This study was supported in part by NIH grant 1R01EB000238, the Dyson Foundation, the St. Giles Foundation and Research to Prevent Blindness.

Competing interests None.

Ethics approval The study and data accumulation were carried out with prospective approval from the Weill Cornell Medical Center Institutional Review Board (IRB) (#0508008050) and was conducted in compliance with the tenets of the Declaration of Helsinki. Informed Consent for the research was obtained from the patients and the study is in accordance with HIPAA regulations.

Provenance and peer review Not commissioned; externally peer reviewed.

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