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# The retinal ganglion cell layer reflects neurodegenerative changes in cognitively unimpaired individuals

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### **Abstract**

**Background:** To evaluate a wide range of optical coherence tomography (OCT) parameters for possible application as a screening tool for cognitively healthy individuals at risk of Alzheimer's disease (AD), assessing the potential relationship with established cerebrospinal fluid (CSF) core AD biomarkers and magnetic resonance imaging (MRI).

**Methods:** We studied 99 participants from the Valdecilla Study for Memory and Brain Aging. This is a prospective cohort for multimodal biomarker discovery and validation that includes participants older than 55 years without dementia. Participants received a comprehensive neuropsychological battery and underwent structural 3-T brain MRI, lumbar puncture for CSF biomarkers (phosphorylated-181-Tau (pTau), total Tau (tTau), beta-amyloid 1–42 (A $\beta$  1–42), and beta-amyloid 1–40 (A $\beta$  1–40)). All individuals underwent OCT to measure the retinal ganglion cell layer (GCL), the retinal nerve fiber layer (RFNL), the Bruch's membrane opening-minimum rim width (BMO-MRW), and choroidal thickness (CT). In the first stage, we performed a univariate analysis, using Student's *t*-test. In the second stage, we performed a multivariate analysis including only those OCT parameters that discriminated at a nominal level, between positive/negative biomarkers in stage 1.

**Results:** We found significant differences between the OCT measurements of pTau- and tTau-positive individuals compared with those who were negative for these markers, most notably that the GCL and the RNFL were thinner in the former. In stage 2, our dependent variables were the quantitative values of CSF markers and the hippocampal volume. The  $A\beta$  1–42/40 ratio did not show a significant correlation with OCT measurements while the associations between pTau and tTau with GCL were statistically significant, especially in the temporal region of the macula. Besides, the multivariate analysis showed a significant correlation between hippocampal volume with GCL and RNFL. However, after false discovery rate correction, only the associations with hippocampal volume remained significant.

**Conclusions:** We found a significant correlation between Tau (pTau) and neurodegeneration biomarkers (tTau and hippocampus volume) with GCL degeneration and, to a lesser degree, with damage in RFNL. OCT analysis constitutes

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a non-invasive and unexpensive biomarker that allows the detection of neurodegeneration in cognitively asymptomatic individuals.

**Keywords:** Alzheimer's disease, Optical coherence tomography, Amyloid, Tau, Ganglion cell layer, Retinal nerve fiber layer, Neurodegeneration, Hippocampal volume

### **Background**

To date, there is no disease-modifying treatment for Alzheimer's disease (AD). In particular, clinical trials with anti-amyloid drugs have consistently failed to show efficacy in clinical endpoints. However, it is likely that these studies have been conducted in individuals in advanced stages of the disease, in whom lowering amyloid levels might not be enough to halt the disease progression [1]. There is a consensus in the field that clinical trials with potentially disease-modifying treatments should be performed in the early stages of AD. Therefore, it is necessary to develop tests to identify those individuals who are asymptomatic or very mildly symptomatic, but who have a high risk of progressing to cognitive impairment.

The core biomarkers used in AD research can be divided into three categories: (1) biomarkers of betaamyloid (Aβ) brain deposition: high ligand retention on amyloid positron emission tomography (PET) or low cerebrospinal fluid (CSF) beta-amyloid 1-42 (Aβ 1-42) and Aβ 1–42/40 ratio [2–4]; (2) biomarkers of AD-associated Tau pathology: elevated CSF phosphorylated Tau (pTau) and Tau-PET [4, 5], and (3) biomarkers of neurodegeneration or neuronal injury: CSF total Tau (tTau), <sup>18</sup>F-fluorodeoxyglucose (FDG)-PET hypometabolism, and atrophy on structural magnetic resonance imaging (MRI) [5, 6]. Advances in the technique and standardization of CSF biomarkers and the emergence of amyloid and Tau-PET have considerably improved the ability to detect preclinical individuals with AD pathological changes and currently are considered as gold standard tests [7-10]. However, despite the increasing attempts to integrate biomarkers into clinical decision-making, diagnosis supported by them is still considered appropriate only for research-related purposes [11]. The clinical environment has not yet evolved properly for this to occur due to challenges with cost, standardization, and accessibility [12, 13]. Therefore, there is an urgent need to develop noninvasive, affordable, and scalable biomarkers. The aim would be to detect preclinical individuals at high risk of cognitive deterioration, as well as to allow monitoring of the effects of disease-modifying treatments.

The retina, a developmental outgrowth of the brain, is considered a window to study disorders in the central nervous system [14–16]. The link between the eye and AD has been established clinically, histologically, and through technological devices such as optical coherence

tomography (OCT) [17]. OCT provides a cross-sectional structure of the retina with extremely high resolution, typically on the micrometer scale. The main advantages of OCT for diagnosing probable AD include its non-invasive nature, its wide availability, and the resulting retinal images, which can be analyzed both objectively and qualitatively [18]. There is growing evidence supporting the incorporation of OCT technology into clinical settings managing neurological diseases [19-21]. Currently, the identification of retinal biomarkers in AD using OCT remains an area of active research, and a growing number of studies indicate that OCT reflects AD pathology in individuals with dementia and those in prodromal stages [22–28]. However, few studies have assessed the role of OCT as an AD biomarker in preclinical individuals [22, 29, 30], and even fewer have used CSF AD biomarkers as a gold standard [29]. Based on the above evidence, we propose to evaluate OCT for its potential applications as a population screening tool. The objective of the present study is to explore a wide range of OCT parameters in a well-phenotyped group of community dwellers. OCT measurements included were the retinal ganglion cell layer (GCL) thickness, the peripapillary retinal nerve fiber layer (RFNL) thickness, the Bruch's membrane opening-minimum rim width (BMO-MRW), and the choroidal thickness (CT). We evaluated their potential relationships with established CSF core AD biomarkers (tTau, pTau, Aβ 1–42, and Aβ 1–40) and MRI (hippocampal volume).

### Methods

### **Participants**

We included participants from the Valdecilla Study for Memory and Brain Aging recruited between July 2018 and February 2020 at the University Hospital Marqués de Valdecilla (UHMV) in Santander, Spain. This is a prospective study for multimodal biomarker discovery and validation that includes community dwellers older than 55 years. A comprehensive neuropsychological battery, which comprises the main cognitive domains (memory, language, praxis, visual perception, and executive function), was administered by two trained neuropsychologists (AP, MGM). All participants underwent structural 3-T brain MRI, blood draw to obtain DNA and plasma samples, lumbar puncture for CSF biomarkers, and ophthalmological evaluation. Subjects with a history

of dementia, neurological or psychiatric disorders, any significant systemic illness, or current use of any medications known to affect cognition were excluded. Ophthalmological exclusion criteria were a refractive error > 6.0 or < 6.0 diopters (D) of spherical equivalent or 3.0 D of astigmatism, any history or showing evidence of ocular surgery or ocular disease, best-corrected visual acuity as poor as 20/40, intraocular pressure (IOP) > 18 mmHg, or history of raised IOP. Similarly, other exclusion criteria included clinically relevant opacities of the optic media and low-quality images due to unstable fixation.

The study protocol and the written consent were approved by the Ethics Committee of the UHMV (reference number 2018.111), and it was performed following the principles of the Declaration of Helsinki. Written consent forms were signed by all participants before examinations.

### Neuropsychological episodic memory testing

To evaluate the medial temporal lobe (MTL) function, the verbal episodic memory of all participants was assessed using the Free and Cued Selective Reminding Test (FCSRT; Buschke, 1984). We used FCSRT delayed total recall as our main variable for episodic memory (0-16).

### CSF samples acquisition and analysis

The CSF biomarker assessment included the determination of A $\beta$  1–42, A $\beta$  1–40, tTau, and p-181-Tau. The levels of biomarkers were quantified by chemiluminescent enzyme-immunoassay (Lumipulse G600 II, Fujirebio Europe, Belgium) following the manufacturer's instructions and interpreted according to the previously established cutoff points [31]. To adjust for individual differences in total amyloid production, A $\beta$ 42 was expressed relative to A $\beta$ 40 (ratio A $\beta$ 1–42/40).

### Magnetic resonance imaging

All images were acquired in the same 3T Philips Medical Systems MRI scanner (Achieva, Best, The Netherlands) using an 8-channel head coil at the UHMV. A sagittal MPRAGE T1-weighted sequence was acquired with the following parameters: flip angle  $9^{\circ}$  shortest TR and TE, voxel size = 1.2 mm, and 170 contiguous slices.

To segment the hippocampus, the automated Free-Surfer protocol was used (FreeSurfer version 6.0 (http://surfer.nmr.mgh.harvard.edu)). Briefly, the protocol included the removal of non-brain tissue, labeling volumes of each segmentation, and normalizing the voxel intensities. Next, cortical and subcortical volume measures were inferred using the surface stream and the subcortical segmentation stream, respectively [32].

Subcortical measures were automatically derived from the subcortical processing stream (i.e., "aseg.stats" in FreeSurfer). Quality checks of acquired data were conducted using the ENIGMA Consortium quality control protocol (http://enigma.ini.usc.edu/).

### Ophthalmological assessment

All participants underwent a thorough ophthalmologic examination on the day of OCT imaging: best-corrected visual acuity (Snellen charts), anterior segment biomicroscopy, refraction, OCT measurements, axial length (AL) assessment, IOP quantification with Goldmann applanation tonometer (GAT), and dilated fundus examination. Participants received one drop of tropicamide 1% and phenylephrine per eye for pupil dilation after OCT evaluation to preclude modifications in choroidal thickness due to phenylephrine instillation as has been previously reported [33]. The refractive error was recorded using an auto refractometer Canon RK-F1 (Canon USA Inc., Lake Success, NY, USA). AL was measured using a Lenstar LS 900 (Haag Streit AG, Koeniz, Switzerland). Each individual was randomized to decide which eye was to be examined first, using the method described by Dulku et al. [34].

# Spectral-domain OCT imaging

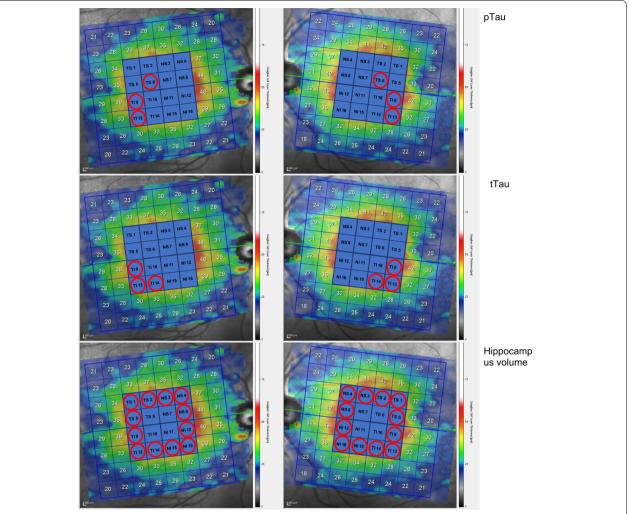
A well-trained ophthalmologist (ALE) performed all OCT exams of each eye for each patient using spectral-domain OCT (SD-OCT) (Spectralis, Heidelberg Engineering, Heidelberg, Germany) and checked all images from each eye to identify any segmentation or centering errors.

### Ganglion cell layer thickness

The retinal thickness was measured with posterior pole analysis (PPA) software of SD-OCT. This protocol has been described in detail [35]. The average retinal layer measurement of each  $8\times 8$  (3°  $\times$  3°) sector (64 sectors) was determined. To simplify the study, we considered  $4\times 4$  central grids for analysis. Those 16 sectors were numbered as shown in Fig. 1, with temporal (T), nasal (N), superior (S), and inferior (I) labels added to ease understanding. The superior cluster included 1–8 sectors, whereas the inferior cluster included 9–16 sectors (Fig. 1). A segmentation analysis was performed using the Heidelberg segmentation software (version 1.10.2.0) to calculate the thickness of the GCL considering APOSTEL recommendations [36].

### Peripapillary retinal nerve fiber layer thickness

The "Glaucoma Module Premium Edition" (GMPE) provided by Spectralis version 6.0c was used to evaluate optic nerve variations in AD. This technology has proven useful in glaucoma disease [37] and also for



**Fig. 1** Representation of the optical coherence tomography (OCT) scan of the macula with posterior pole analysis (PPA). PPA is divided into 16 sectors numbered from 1 to 16. Temporal sectors included TS1, TS2, TS5, TS6, TI9, TI10, TI13, and TI14; nasal sectors are NS3, NS4, NS7, NS8, NI11, NI12, NI15, and NI16. Superior sectors were labeled from 1 to 8, whereas inferior sectors were from 9 to 16. The first PPA analysis is related to CSF pTau, the second image is related to CSF tTau, and the last PPA is related to hippocampus volume. Red circles highlight the GCL sectors with significant damage. CSF, cerebrospinal fluid; GCL, ganglion cell layer

evaluating optic discs with anatomical variations [38]. The BMO-MRW study is widely used in glaucoma but not in neurodegenerative diseases, so we performed it for two reasons. On the one hand, we employed it to detect and exclude participants with glaucoma disease. On the other hand, we wanted to provide a more indepth analysis of the optic nerve in AD because damage to the peripapillary axons of the optic nerve in advanced stages of AD has been widely described [39], but there are some controversial results in the prodromal stages [22, 29, 30].

GMPE includes 24 radial scans for the neuroretinal rim analysis (BMO-MRW) and 3 circular scans for the RNFL analysis [40]. From the 3 circular scans, we

registered only the figures provided by the inner circle scan. Six sector areas (superior-temporal (ST), superior (S), superior-nasal (SN), inferior-nasal (IN), inferior (I), and inferior-temporal (IT)), as well as their average, were measured in both analyses.

# Choroidal thickness

CT was measured using enhanced depth imaging (EDI) Spectralis SD-OCT. CT was measured at 14 different locations as it has been previously described [25]: at the fovea (with horizontal and vertical scan: FH and FV, respectively) and at 500, 1000, and 1500  $\mu$ m from the fovea in the N, T, S, and I quadrants.

### Data analysis

In the first stage of the analysis, we dichotomized all individuals according to their CSF AD biomarker status using previously established cutoff points [31]. Next, potential confounders were evaluated by comparing ophthalmological variables (IOP, pachymetry, AL, and refractive error) in individuals with positive versus negative AD biomarkers. For each individual, we calculated the mean value of the two eyes for all OCT measurements (GCL, RNFL, BMO-MRW, and CT). Then, we performed a univariate analysis using Student's *t*-test, comparing OCT parameters in those individuals positive for AD CSF biomarkers versus those who were negative.

In a second stage, we performed multivariate analyses including only those OCT parameters that discriminated, at a nominal level, between individuals with positive versus negative biomarkers in stage 1. We used generalized linear models with the biomarkers' quantitative data as dependent variables (A $\beta$  1–42/40 ratio, pTau, tTau, and hippocampus volume) and the OCT measurements, selected after stage 1, as the main independent variables.

Age and sex were included as covariates in all models. In the second stage, we determined the false discovery rate (FDR) using the Benjamini and Hochberg method to correct for multiple testing due to the many retinal areas explored [41].

Finally, we assessed the relationship between significant OCT parameters and FCSRT delayed total recall using Pearson's r.

All analyses were performed using IBM SPSS Statistics V.20.0 (International Business Machine Corporation, Armonk, NY, USA).

### **Results**

Overall, 99 individuals (191 eyes) were consecutively evaluated in the final analysis. Females were predominant (71%), and the mean age was  $64.7\pm6.3$  years. The demographic and clinical characteristics of the study participants are summarized in Table 1. The majority were cognitively healthy (the mean Mini-Mental State Examination score was  $28.94\pm1.3$ ), and the mean FCSRT delayed total recall was  $15.01\pm2.43$ .

Ophthalmological examination parameters did not show significant associations with CSF AD biomarkers (Additional file 1). Subsequently, we did not consider them as confounding variables for the analysis.

# Stage 1

Outcomes from stage 1 are depicted in Fig. 2. Herein, we compared OCT parameters (RFNL, GCL, CT, and BMO-MRW) between individuals with positive versus negative AD core biomarkers. None of the OCT measurements

**Table 1** Demographic and clinical characteristics

Characteristic	N = 99 individuals
Age (years), mean (SD)	64.9 (6.6)
Female eyes (%)	71%
Spherical equivalent, mean (SD)	0.34 (2.04)
Axial length (mm), mean (SD)	23.18 (1.4)
Intraocular pressure, mean (SD)	13.62 (2.77)
Pachimetry, mean (SD)	28.97 (1.21)
MMSE (0-30), mean (SD)	28.94 (1.3)
FCSRT delayed total recall (0–16), mean (SD)	15.01 (2.43)
CSF Biomarkers	
Aβ40, mean (SD), pg/ml	10,615.01 (3278.23)
Aβ42, mean (SD), pg/ml	819.78 (336.35)
Ratio A $\beta$ 1–42/40, mean (SD)	0.078 (0.02)
Total Tau, mean (SD), pg/ml	330.70 (137.25)
Phosphorylated Tau, mean (SD)	43.97 (26.35)
Hippocampal volume, mean (SD)	3266.08 (372.21)

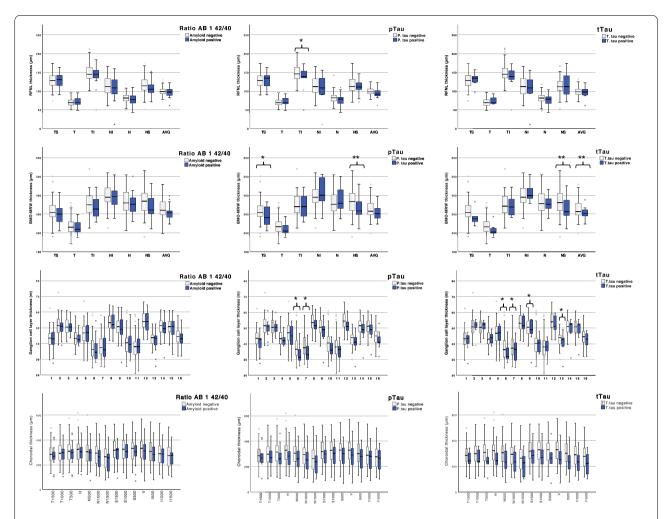
Abbreviations: SD Standard deviation; A $\beta$  Amyloid- $\beta$ , neg, negative; pos Positive, FCSRT Free and Cued Selective Reminding Test

significantly discriminated between individuals positive versus negative for the AB 1-42/40 ratio. Meanwhile, there were several OCT variables, especially those related to GCL, which significantly differed between positive and negative individuals for pTau and tTau CSF biomarkers. We consistently found that in those individuals who were positive for either pTau or tTau, GCL thickness was decreased compared to those who were negative. We found nominally significant differences between pTaupositive and pTau-negative individuals for GCL in 6 TS (p = 0.044) and 7 NS (p = 0.043) sectors. Additionally, GCL significantly discriminated between tTau-positive and tTau-negative in 6 TS (p = 0.049), 7 NS (p = 0.035), 9 TI (p = 0.046), and 13 TI (p = 0.021) sectors. Overall, individuals with positive pTau and tTau biomarkers showed, on average, lower values on the other OCT variables. Significant differences were found between pTau-positive and pTau-negative individuals for BMO-MRW in TS (p = 0.03) and NS (p = 0.014) sectors and RFNL in the TI sector (p = 0.049). We also found significant differences between tTau-positive and tTau-negative individuals for BMO-MRW NS (p = 0.016) and BMO-MRW average (p= 0.002).

Choroidal thickness was not associated with any of the CSF biomarkers.

### Stage 2

In stage 2, we performed a multivariate analysis with the OCT measurements that were associated with CSF markers positivity in stage 1, adjusting for age and sex (Table 2).



**Fig. 2** A representation of the outcomes from the univariant analysis through bar charts. Each OCT parameter was compared with the three AD core biomarkers, Aβ 1-42/40 ratio, pTau, and tTau, and divided into healthy and disease cases by well-known cut-points. \* and \*\* symbols highlight the outcomes with significant p-values (p < 0.05 and p < 0.01, respectively). BMO-MRW, Bruch's membrane opening-minimum rim width; RNFL, retinal nerve fiber layer; GCL, ganglion cell layer; TS, temporal superior; T, temporal; TI, temporal inferior; NI, nasal inferior; N, nasal; NS, nasal superior; AVG, average

Once again, A $\beta$  1–42/40 ratio did not show significant association with any OCT measurements. The association between pTau and tTau with GCL measurements remained significant. Likewise, pTau CSF levels showed significant association with GCL in 6 TS, 9 TI and 13 TI sectors, and tTau showed significant association with GCL in 9 TI, 13 TI, and 14 TI sectors. Regarding RFNL and tTau, only the NI sector showed a significant association. None of the BMO-MRW assessments was significantly associated with any of the CSF markers. However, after the FDR correction, none of these nominal p-values remained significant.

The same multivariate analysis was performed for hippocampal volume. We consistently found that larger

hippocampal volumes were significantly associated with greater GCL thickness and vice versa. As shown in Table 2, GCL 1 TS, 2 TS, 3 NS, 4 NS, 5 TS, 8 NS, 9 TI, 12 NI 13 TI, 14 TI, 15 NI, and 16 NI sectors were statistically associated to hippocampal volume. Besides, RFNL displayed significant association in many sectors: TI, NI, N, and NS. No association was found with BMO-MRW measurements. After FDR correction, most RFNL and CGL OCT measurements remained significantly associated with the hippocampal volume (Table 2).

In Table 3 we present the relationship between the average of all studied sectors of the RNFL, the GCL and BMO-MRW, and all AD biomarkers. Larger hippocampal

 Table 2
 Multivariate analysis including all OCT outcomes statistically significant in the univariate analysis

		Ratio AB 1-42/40		рТаи		tTau		Hippocampal volume	
		Beta (95%Cl)	<i>p</i> -value	Beta (95%CI)	p-value	Beta (95%CI)	<i>p</i> -value	Beta (95%CI)	p-value
BMO-MRW	TS	3.22E-5 (-5.12E-5 to 11.6E-5)	0.444	-0.07 (-0.16 to 0.02)	0.111	-042 (-0.92 to 0.07)	0.092	0.26 (-1.03 to 1.56)	0.688
	<b>-</b>	2.82E-5 (-8.35E-5 to 14.0E-5)	0.503	-0.02 (-0.14 to 0.11)	0.812	-0.14 (-0.81  to  0.54)	0.687	0.40 (-1.36 to 2.16)	0.651
	F	3.16E-5 (-5.08E-5 to 11.4E-5)	0.448	0.01 (-0.08 to 0.10)	0.800	-0.01 (-0.51  to  0.49)	0.968	0.49 (-0.80 to 1.79)	0.448
	Z	2.4E-5 (-4.84E-5  to  9.71E-5)	900.0	0.02 (-0.06 to 0.10)	0.672	0.07 (-0.37 to 0.51)	0.756	0.80 (-0.32 to 1.92)	0.158
	z	4.04E-5 (-3.06E-5 to 11.1E-5)	0.261	-0.03 (-0.11 to 0.05)	0.425	-0.21 (-0.63 to 0.22)	0.336	0.99 (-0.09 to 2.07)	0.071
	NS	6.64E - 5 (-3.06  to  13.5E - 5)	0.056	-0.07 (-0.15 to 0.01)	0.073	-0.56 (-0.78  to  0.07)	0.099	0.76 (-0.37 to 1.89)	0.183
RNFL	Z	- 9.23E-5 (- 32.5E-5 to 14.1E-5)	0.434	0.08 (-0.18 to 0.34)	0.561	0.49 (-0.90 to 1.88)	0.485	1.18 (-2.63 to 4.98)	0.539
	F	-13.8E-5 (-0.001  to  27.1E-5)	0.505	0.32 (-0.12 to 0.78)	0.150	2.22 (-0.18 to 4.61)	690.0	-0.19 (-7.00 to 6.60)	0.954
	F	7.68E - 5 (-10.7E - 5  to  26.1E - 5)	0.408	-0.17 (-0.37  to  0.04)	0.108	-0.97 (-2.05  to  0.11)	0.076	3.77 (0.90 to 6.63)	0.011*
	Z	5.71E-5 (-11.0E-5  to  22.5E-5)	0.500	-0.15 (-0.33 to 0.04)	0.120	-1.02 (-2.00 to -0.41)	0.041	3.38 (0.75 to 6.01)	0.013*
	z	5.08E-5 (-23.7E-5 to 33.8E-5)	0.726	-0.04 (-0.36 to 0.28)	0.813	-0.76 (-2.47  to  0.94)	0.337	6.81 (2.45 to 11.17)	0.003*
	NS	0.00 (-7.63E-5 to 31.5E-5)	0.228	-0.10 (-0.32 to 0.12)	0.364	-0.71 (-1.87 to 0.46)	0.232	4.25 (0.96 to 7.54)	0.012*
CGL	TS 1	-1.94E-5 (-0.001  to  0.001)	0.959	-0.53 (-1.36 to 0.29)	0.200	-2.26 (-6.70  to  2.18)	0.314	17.13 (5.69 to 25.57)	0.004
	TS 2	-8.72E-5 (-0.001  to  0.001)	0.823	-0.37 (-1.23 to 0.48)	0.390	-1.97 (-6.57 to 2.64)	0.398	15.58 (3.54 to 27.62)	0.012*
	NS 3	0.00 (-0.001 to 0.001)	0.722	-0.12 (-1.09 to 0.86)	0.811	-0.88 (-6.13 to 4.36)	0.738	17.85 (3.89 to 31.81)	0.013*
	NS 4	0.00 (-0.001 to 0.001)	0.744	-0.12 (-1.13 to 0.89)	0.812	-0.73 (-6.14  to  4.67)	0.788	17.33 (2.51 to 32.16)	0.023*
	TS 5	4.14E-5 (-0.001  to  0.001)	0.902	-0.41 (-1.15 to 0.32)	0.268	-2.61 (-6.56 to 1.35)	0.193	14.66 (4.58 to 24.74)	*500.0
	1S 6	0.00 (0.000 to 0.001)	0.123	-0.78 (-1.49 to -0.07)	0.032	-3.57 (-7.42 to 0.28)	690:0	4.23 (-6.25 to 14.70)	0.424
	NS 7	0.00 (0.000 to 0.001)	0.193	-0.65 (-1.36 to 0.05)	0.070	-3.25 (-7.07  to  0.57)	0.094	6.08 (-4.28 to 16.44)	0.246
	NS 8	-1.56E-5 (-0.001  to  0.001)	0.971	-0.44 (-1.40 to 0.52)	0.361	-3.08 (-8.21 to 2.05)	0.235	18.93 (5.68 to 32.19)	*900'0
	TI9	0.00 (0.000 to 0.001)	0.516	-0.88 (-1.69 to -0.08)	0.032	-4.76 (-9.07  to  -0.44)	0.031	13.26 (1.75 to 24.77)	0.025*
	TI 10	0.00 (-0.001 to 0.001)	0.726	-0.46 (-1.21 to 0.28)	0.219	-1.49 (-5.51 to 2.54)	0.465	2.79 (-8.02 to 13.62)	809.0
	N 11	0.00 (0.000 to 0.001)	0.705	-0.37 (-1.04 to 0.31)	0.285	-1.61 (-5.25 to 2.04)	0.384	4.06 (-5.70 to 13.82)	0.410
	NI 12	0.00 (-0.001 to 0.001)	0.480	-0.69 (-1.63 to 0.26)	0.150	-3.87 (-8.94 to 1.19)	0.132	13.53 (0.01 to 27.05)	0.050
	TI 13	0.00 (-0.001 to 0.001)	0.494	-1.04 (-2.05 to -0.02)	0.045	-5.43 (-10.89 to 0.03)	0.051	20.42 (5.70 to 35.14)	*2000
	TI 14	0.00 (-0.001 to 0.001)	0.567	-0.81 (-1.70 to 0.08)	0.073	-4.65 (-9.42  to  0.11)	0.055	16.39 (3.68 to 29.10)	0.012*
	TI 15	3.81E-5 (-0.001 to 0.001)	0.926	-0.75 (-1.65 to 0.14)	0.097	-4.38(-9.17  to  0.41)	0.073	14.24 (1.37 to 27.12)	0.031*
	TI 16	0.00 (-0.001 to 0.001)	0.458	-0.70 (-1.65 to 0.25)	0.146	-3.43 (-8.54 to 1.69)	0.187	16.04 (2.23 to 29.85)	0.023*

Significative values (p < 0.005) are in bold

Significative values after the false discovery rate are distinguished with an asterisk

Abbreviations: BMO-MRW, Bruch's membrane opening-minimum rim width; GCL, ganglion cell layer; I, inferior; N, nasal; RNFL, retinal nerve fiber layer; S, superior; T, temporal

Table 3 Multivariate analysis including the average of OCT outcomes statistically significant in the univariate analysis

	Ratio AB 1 42/40		рТаи		tTau		Hippocampal volume	
	Beta (95%CI)	p-value	Beta (95%CI)	p-value	Beta (95%CI)	<i>p</i> -value	Beta (95%CI)	p-value
AVG BMO-MRW	<b>AVG BMO-MRW</b> 6.47E-5 (-2.74E-5 to 15.7E-5) 0.166	0.166	-0.5 (-0.16 to 0.06)	0.335	-0.21 (-0.79 to 0.36)	0.465	1.32 (-0.16 to 2.80)	0.080
AVG RNFL	8.97E - 5 (-29.6E - 5  to  47.6E - 5) 0.645	0.645	-0.14 (-0.57  to  0.29)	0.517	-1.06 (-3.36  to  1.23)	0.361	8.91 (3.06 to 14.76)	0.003
AVG GCL	-0.00 (-0.001  to  0.001)	0.097	-0.87 (-1.89 to 0.16)	0.097	-4.46 (-9.99 to 1.06)	0.112	18.04 (3.50 to 32.58)	0.016

Abbreviations: BMO-MRW Bruch's membrane opening-minimum rim width, GCL Ganglion cell layer, I Inferior, N Nasal, RNFL Retinal nerve fiber layer, S Superior, T Temporal Significative values (p < 0.005) are in bold

**Table 4** Multivariate analysis including ganglion cell layer analysis clustered in 4 sectors

	Ratio AB 1 42/40		pTau		tTau		Hippocampal volume	
	Beta (95%CI)	<i>p</i> -value	Beta (95%CI)	<i>p</i> -value	Beta (95%CI)	<i>p</i> -value	Beta (95%CI)	<i>p</i> -value
GCL TS	1.86E-4 (-0.001 to 0.001)	0.655	- 0.74 (- 1.64 to 0.17)	0.109	- 3.66 (- 8.54 to 1.21)	0.139	16.73 (4.10 to 29.37)	0.010*
GCL NS	1.45E-4 (-0.001 to 0.001)	0.771	-0.59 (-1.67 to 0.50)	0.284	- 3.35 (- 9.17 to 2.48)	0.257	20.15 (4.73 to 35.57)	0.011*
GCL TI	2.30E-4 (-0.001 to 0.001)	0.520	-1.04 ( $-2.03$ to $-0.05$ )	0.039	-5.20 (-10.52 to 0.13)	0.050	15.89 (1.70 to 30.09)	0.029*
GCL NI	2.54E-4 (-0.001 to 0.001)	0.582	-0.83 (-1.83 to 0.17)	0.103	-4.32 (-9.70 to 1.07)	0.115	14.69 (0.38 to 29.01)	0.044*

Significative values (p < 0.005) are in bold

Significative values after the false discovery rate are distinguished with an asterisk

Abbreviations: GCL Ganglion cell layer, I Inferior, N Nasal, RNFL Retinal nerve fiber layer, S Superior, T Temporal

volumes were significantly associated with greater RNFL and GCL thickness measurements.

In Table 4, the GCL data is grouped into 4 main sectors (TS, NS, TI, and NI) to obtain a summary view. Each contains the mean thickness of each area (mean of both eyes). TS is the compound of the mean thickness of sectors 1, 2, 5, and 6; NS is the compound of 3, 4, 7, and 8 sectors; TI is the compound of 9, 10, 13, and 14 sectors; and NI is the compound of 11, 12, 15, and 16 sectors. The TI sector shows nominal associations with all Tau and hippocampal volume markers. After FDR correction, the associations with the hippocampal volume remained significant.

Finally, the FCSRT delayed total recall did not show any correlation with the OCT parameters.

### Discussion

Our main results show a nominally significant association between Tau (pTau) and both neurodegeneration biomarkers (tTau and, especially, hippocampal volume) and GCL degeneration. To a lesser degree, we detected an association betweent Tau and hippocampal volume with RFNL. Despite the exploratory nature of our design, the consistency of our results is remarkable, as all of the GCL associated areas showed the same pattern: the more tTau or pTau levels in the CSF, the thinner was the GCL layer. The opposite was found for the hippocampal volume: larger hippocampal volumes were associated with thicker GCL layers and vice versa. Moreover, the same patterns were present in the RFNL analysis. However, after adjusting the *p*-values using FDR correction, only the hippocampal volume was associated with GCL and RFNL parameters. In contrast, CT did not show any significant correlation with CSF biomarkers, and BMO-MRW measurements were associated with pTau and tTau status in isolated sectors, but p-values did not survive multivariate analysis. Overall, we found that none of the OCT measurements was associated with the amyloid biomarker (CSF Aβ 1-42/40 ratio). Finally, we found no association between the episodic memory test, FCSRT, and any of the OCT biomarkers, which is concordant with the hypothesis that retinal changes precede cognitive problems.

The recent research framework for AD proposes an A/T/N classification system based on biomarkers in living patients, independently of cognitive status: "A" refers to the Aβ biomarker (Aβ PET or CSF), "T" refers to pathologic Tau (CSF pTau or PET-Tau), and "N" refers to neurodegeneration (CSF tTau, FDG-PET, or structural MRI) [42]. This new research framework is based on the rationale that AD is a continuum and the A/T/N classification captures the sequential pathological changes starting with Aβ deposition that would produce Tau pathology and, finally, neurodegeneration. Our results support the concept of AD as a continuous biological process [42, 43]. While no OCT measurements correlated with the Aβ biomarker, changes in the retina became significant in those individuals with positive pTau, especially in relation with positive neurodegeneration biomarkers like tTau and hippocampal atrophy. As shown in Fig. 1, the GCL damage was more extensive in those individuals whose biomarker profile showed a more advanced disease course. Moreover, we found that the correlation between CSF pTau and tTau (6 TS, 9 TI, 13 TI and 9 TI, 13 TI, 14 TI, respectively) with GCL was strongest in the macular peripheral sectors. The same pattern, with even larger effects, was found in the hippocampal volume analysis.

Only a handful of studies have suggested a link between AD biomarkers and retinal OCT measurements in cognitively unimpaired individuals [22, 29, 30]. Particularly, Asanad et al. [29] reported that the mean RFNL was thinner in individuals that had CSF biomarkers of AD pathology before cognitive deficits. Santos et al. [30] also found larger RNFL damage in preclinical AD relative to controls and related this damage to increased neocortical amyloid accumulation detected by  $^{18}\text{F-florbetapir}$  A $\beta$  PET. In contrast to our study, Santos and co-authors did not find an association between GCL thinning and AD biomarkers [30]. One possible explanation for these conflicting results is that some of the aforementioned

studies have less statistical power. While our population included 99 individuals (mean of both eyes, 191 eyes in total), these previous studies evaluated 43 participants and 56 eyes, respectively. In line with our results, Golzan et al. reported a significant difference in GCL thickness between AD, preclinical AD, and healthy controls [22]. However, they found no association between OCT measurements and PET imaging evidence of brain amyloidosis [22]. In comparison, in our study, we used CSF biomarkers, which are known to detect Alzheimer's pathological changes earlier than PET [44].

Other studies have investigated the relationship between MRI and retinal thickness in cognitively normal subjects, describing the association between gray matter volume or temporal lobe atrophy and retinal layer [28, 45, 46]. Casaletto et al. demonstrated an association between GCL loss and RNFL thinning with MTL atrophy in neurologically normal older adults [45]. Also, in line with our results, another group found that macular GCL and inner plexiform layer (IPL) thinning was associated with lower gray matter volume of the occipital and temporal lobes in elderly subjects [47]. Our results, adjusted by age, show that GCL damage is related not only to hippocampal atrophy but also to increased CSF pTau and tTau, suggesting that the most likely mechanism would be preclinical AD changes. According to this, Bevan et al. [48] reported, in a transgenic AD model, that degeneration in GCL happens simultaneously with the loss of hippocampal dendritic spines. Interestingly, this constitutes a key hallmark of AD research models, with spine loss particularly acute in the vicinity of amyloid plaques [49].

Despite the cross-sectional design, the predominant association between pTau CSF levels and thinning of the macular temporal peripheral sector of GCL would suggest that it is in this area where we might find the earliest AD-related degenerative changes in the retina of cognitively unimpaired individuals. Retinal ganglion cells, neurons located in the retinal GCL (mostly in the macula), are characterized by a soma from which the originating axon runs initially into the RNFL. Subsequently, these axons converge turning into the optic disc. There is increasing evidence describing the existence of AD pathology in the retina of AD patients [17, 50–58], specifically in the GCL [59]. However, the localization of these changes has been controversial. Neuroretinal damage (RFNL or GCL) in the upper, lower, or temporal macular sectors has been described [24, 27, 28, 60, 61], most likely reflecting that the tissues belonged to individuals at different time points in the Alzheimer's continuum. Koronyo et al studied the distribution of Aβ plaques in the retina, reporting that AB deposits were frequently concentrated in the middle and far periphery of the superior quadrants along the blood vessels [17]. In line with our results, a recent study found that the mid-peripheral retina showed more AD pathology than the central retina [62]. Furthermore, this study showed that the temporal retina had the strongest correlations with brain neuritic plaques and cerebral amyloid angiopathy, and this area showed the greatest contrast between AD and controls, leading the authors to suggest that it might be the optimal location for in vivo ocular imaging [62].

### Limitations

A potential technical limitation of our study is the fact that CT thickness was measured manually after the EDI-OCT scan, providing us with a choroidal analysis based on subjective, non-automated measurements. To help overcome this hurdle, we tested the agreement in a control sample, and as shown in a previous publication, we proved to have high intra-observer and interobserver reproducibilities [25]. A more general limitation of the present study is the relatively small sample size in comparison with the large number of OCT parameters measured, which might increase the probability of false positives. However, with our two-step design, we have sought to minimize the type 1 error. Additionally, we performed a FDR correction to account for multiple testing due to the large number of areas tested. Most importantly, we think that the consistency of the OCT associations across several biomarkers with similar meaning, like tTau and hippocampal volume, makes it highly unlikely that our results are explained by chance alone.

### Conclusions

Our main finding was the significant association between GCL thickness, measured by OCT, with Tau and neurodegeneration biomarkers in cognitively unimpaired individuals. According to our results, macular temporal peripheral sectors of GCL may represent the areas with the greatest clinical potential for early screening; but this hypothesis requires sequential studies in a larger population to evaluate their clinical utility. Even though our study represents the largest cohort of cognitively unimpaired individuals assessed with OCT and multimodal AD biomarkers to date, our results should be considered exploratory. Future investigations including larger samples and analyzing prospectively the spatiotemporal changes of OCT measurements are needed to optimize the diagnostic utility of retinal imaging modalities in the diagnosis of preclinical AD.

### Abbreviations

AD: Alzheimer's disease; A $\beta$ : Beta-amyloid; A $\beta$  1–42: Beta-amyloid 1–42; BMO-MRW: Bruch's membrane opening-minimum rim width; CSF: Cerebrospinal fluid; CT: Choroidal thickness; D: Diopters; EDI: Enhanced depth imaging;

FDG: <sup>18</sup>F-fluorodeoxyglucose; FDR: False discovery rate; FCSRT: Free and Cued Selective Reminding Test; GCL: Ganglion cell layer; IN: Infero-nasal; I: Inferior; IT: Infero-temporal; IOP: Intraocular pressure; MRI: Magnetic resonance imaging; UHMV: Marqués de Valdecilla; OCT: Optical coherence tomography; pTau: Phosphorylated Tau; PET: Positron emission tomography; PPA: Posterior pole analysis; RFNL: Retinal nerve fiber layer; ST: Superior-temporal; S: Superior; SN: Superior-nasal; FH: Subfoveal horizontal scan; FV: Subfoveal vertical scan; tTau: Total Tau.

# **Supplementary Information**

The online version contains supplementary material available at https://doi.org/10.1186/s13195-022-00998-6.

**Additional file 1.** Ophthalmological variables analysis as possible confounders. Potential confounders were evaluated by comparing ophthalmological variables (like IOP, pachymetry, AL and refractive error) in individuals with positive versus negative AD biomarkers. These variables did not show significant associations with CSF AD biomarkers.

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### Authors' contributions

AL-de-E designed the work; acquired, analyzed, and interpreted the data; drafted the work and substantively revised it; and approved the submitted version. SLG approved the submitted version. CL approved the submitted version. AP approved the submitted version. MGM approved the submitted version. MK approved the submitted version. Jl acquired and analyzed the data and approved the submitted version. MLH approved the submitted version. PMC analyzed the data and approved the submitted version. DTG acquired and analyzed the data and approved the submitted version. CN acquired the data. AG revised the work and approved the submitted version. ERR revised the work and approved the submitted version. ERR revised the work and approved the Submitted version. AC designed the work and analyzed and interpreted the data. PSJ designed the work, analyzed and interpreted the data the work, and substantively revised it. The author(s) read and approved the final manuscript.

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Availability of data and materials

The datasets used and/or analyzed during the current study are available from the corresponding author on reasonable request.

### **Declarations**

# Ethics approval and consent to participate

The study protocol and the written consent were approved by the Ethics Committee of the UHMV (reference number 2018.111), and it was performed following the principles of the Declaration of Helsinki. Written consent forms were signed by all participants before examinations. All patients enrolled were able to understand the information contained in the written consent and they were not legally incompetent.

### Consent for publication

Not applicable.

### Competing interests

The authors declare that they have no competing interests.

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