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# Assessment of individual retinal layer thickness and vascular changes in Alzheimer's disease

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Alzheimer's disease (AD) is a leading cause of dementia, underscoring the need for early and accurate diagnostic methods. This cross-sectional study examines the thickness of individual retinal layers and vessel density (VD) in 23 patients with AD and 22 healthy controls (HC). All participants underwent comprehensive ophthalmologic assessments and cognitive evaluations. AD patients exhibited significantly reduced mean macular retinal thickness compared to HC in foveal and parafoveal areas (p < 0.05). The most significant differences were noted in specific sectors of the Inner Nuclear Layer (INL) and Outer Nuclear Layer (ONL) (p < 0.05), while no significant changes were found in the Outer Retinal Layer (p > 0.05). Additionally, AD patients showed decreased VD in the deep vascular plexus (DVP) (p = 0.030) and an increased foveal avascular zone (FAZ) (p = 0.021). The areas under the receiver operating characteristic curves (AUC) analysis revealed the highest diagnostic accuracy for ONL thickness in the S2 sector (0.79) and for mean macular thickness in C0 and T1 sectors (0.76). Positive correlations were observed in some areas between individual retinal layers and VD in their corresponding vascular plexuses in the AD group. The findings suggest that alterations in retinal layer thickness and VD may serve as potential non-invasive diagnostic markers for AD.

**Keywords** Alzheimer's disease (AD), Retinal layer thickness, Vessel density (VD), Optical coherence tomography (OCT), Deep vascular plexus (DVP), Diagnostic markers

Alzheimer's disease (AD) is a chronic neurodegenerative disorder and the most common cause of dementia among the elderly<sup>1</sup>. First identified in the early 20th century, it remains without an effective treatment, highlighting the need for early detection and accurate diagnosis to slow the progression of neurodegenerative processes<sup>2,3</sup>.

In 2018, the National Institute on Aging and the Alzheimer's Association (NIA-AA) revised the diagnostic framework for AD, proposing a biomarker classification system known as A/T/N. This system integrates three types of biomarkers,  $\beta$ -amyloid (A $\beta$ ) accumulation, pathological tau (T), and neurodegeneration or neuronal injury markers (N), to enhance diagnostic accuracy<sup>4</sup>. Notably, these biomarkers may show abnormalities in the preclinical phase of AD, which precedes the onset of behavioral symptoms<sup>5</sup>. Current diagnostic methods—such as positron emission tomography (PET), tau-PET, and lumbar puncture for assessing A $\beta$  or tau levels in cerebrospinal fluid—are frequently expensive, invasive, and time-consuming<sup>6,7</sup>. These limitations drive the search for alternative diagnostic strategies that confirm AD faster and less invasively.

The interconnection between the brain and the retina has significant implications for the diagnosis of neurodegenerative diseases, including  $AD^8$ . The accumulation of  $A\beta$  in the retina may serve as an early indicator of brain pathology. Retinal ganglion cells (RGC), which contribute to the optic nerve, are known to transport amyloid precursor protein, suggesting that retinal changes may reflect underlying brain processes. This relationship opens avenues for the development of non-invasive diagnostic methods that may facilitate early detection of neurodegenerative diseases through retinal assessment. Moreover, understanding this relationship may pave the way for new therapeutic options for diseases affecting the nervous system.

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Since the introduction of optical coherence tomography (OCT) in the 1990s, measurements of the peripapillary retinal nerve fiber layer (pRNFL) thickness has become a widely accepted parameter in the diagnosis and monitoring of various conditions, especially those affecting the optic nerve, such as glaucoma<sup>10,11</sup>. In particular, thinning of the pRNFL and the ganglion cell layer (GCL) due to retinal ganglion cells (RGC) damage has been observed in neurodegenerative diseases, including Parkinson's disease<sup>12</sup>, multiple sclerosis<sup>13</sup>, dementia with Lewy bodies<sup>14</sup>, and especially AD<sup>15</sup>.

OCT angiography (OCTA) extends the capabilities of OCT by providing a non-invasive method for both quantitative and qualitative assessment of vascular status in the macula and optic nerve head (ONH). Postmortem studies of AD patients have shown that neuronal apoptosis in the central nervous system correlates with vascular changes, specifically amyloid angiopathy<sup>16</sup>. These pathological alterations affect not only neuronal cells but also the vascular system, highlighting the potential of OCTA as a valuable diagnostic tool for AD<sup>17</sup>.

Recent studies using spectral-domain OCT (SD-OCT) have identified significant changes in retinal thickness surrounding the macula, particularly in specific layers such as the pRNFL and the ganglion cell layer (GCL)<sup>18,19</sup>. Additionally, a decrease in vascular density (VD), particularly in the deep vascular plexus (DVP), has been documented through OCTA<sup>20</sup>. However, the individual retinal layers with the most pronounced thickness changes have not been thoroughly investigated.

The aim of this study was to investigate the thickness of individual retinal layers in the macula and analyze the correlations between these measurements and vascular density in the corresponding superficial vascular plexus (SVP) and DVP among patients with AD. Additionally, the study evaluated the diagnostic capability of these measurements—including both retinal layer thickness and VD—in discriminating AD from a healthy control group (HC).

#### Results

Nine eyes were initially excluded from the analyses due to poor image quality caused by vitreous floaters, motion artifacts, and incorrect segmentation in OCTA or SD-OCT examinations. A total of 55 eyes were included in the final evaluation and statistical analyses, comprising 23 eyes from the AD group and 22 eyes from the HC group. No significant differences in age, gender, or BCVA (best corrected visual acuity) were observed between the groups (p < 0.05). The AD group exhibited a significantly lower MMSE (mini-mental state examination) score compared to the HC group (p < 0.001). The demographic and clinical characteristics are presented in Table 1.

# Macular retinal thickness

In the analysis of the macular retina, patients with AD showed a significant reduction in mean macular thickness compared to HC participants. The most notable differences between the study groups were found in the following areas: C0 (p=0.003), T1 (p=0.03), N1 (p=0.09), I1 (p=0.014), and S1 (p=0.038). No significant differences were observed in the perifoveal area across any of the assessed quadrants (p>0.05). Regarding the inner retinal layer (IRL) thickness, significant changes were noted between the examined groups, except for two sectors: S2 (p=0.363) and N2 (p=0.195). The largest differences occurred in the C0 sector (p=0.003) and the T1 sector (p=0.005). In contrast, the outer retinal layer (ORL) values were comparable between the AD and HC groups across all examined sectors (p>0.05) (Table 2).

#### Individual macular layer thicknesses in segmentation analysis

Thickness values for all individual layers across the 9 Early Treatment Diabetic Retinopathy Study (ETDRS) sectors were obtained and are presented in Table 3. The most significant differences between the studied groups were observed in the inner nuclear layer (INL) for the following sectors: C0, S1, T1, I1, N1, and I2, as well as in the outer nuclear layer (ONL) for sectors C0, S1, T1, S2, and T2 (p < 0.39). Significant changes were also noted in the inner plexiform layer (IPL) only in sectors C0 and T2 (p < 0.048), as well as in the macular RNFL (mRNFL) and GCL in sector C0 (p < 0.039). Insignificant differences in thickness for the entire analyzed area between studied groups were observed in the OPL (p > 0.05). The most frequent changes were observed in the C0 sector across each analyzed layer (excluding the OPL); however, the most significant change was observed in the T2 sector of the ONL (p < 0.001).

Parameter	AD	НС	p value
Number of eyes (patients)	23(23)	22(22)	
Age (years)	74(64-87)*	71(64-84)*	0.690
Male/Female (%)	38.5/61.5	36.4/63.6	0.369
BCVA (logMAR)	0.0(0.0-0.096)*	0.0(0.0-0.096)*	0.504
MMSE (points)	21(16-26)*	29(27-30)*	< 0.001
SQ (points)	8(6-10)	8(6-9)	0.520
Q score (points)	32(27-37)	30.5(26-38)	0.436

**Table 1**. Demographic and clinical data. \*Median (minimum and maximum values). Statistical significance was assessed using the Mann-Whitney U Test. Significant values appear in boldface. *AD* Alzheimer's Disease, *HC* healthy control, *BCVA* best corrected visual acuity, *MMSE* mini-mental state examination, *SQ* scan quality obtained from the Avanti RTVue XR device, *Q score* quality score obtained from the Heidelberg Spectralis device.

	AD					НС					
Parameter	Median	Min	Max	Q1	Q2	Median	Min	Max	Q1	Q2	p value
Macular reti	na (µm)										
C0	262	213	295	253	278	284	256	312	267	294	0.003
S1	339	299	371	317	342	342	321	362	336	350	0.038
T1	322	279	337	309	328	330	310	349	325	336	0.003
I1	334	293	387	321	336	341	317	362	332	347	0.014
N1	337	295	394	320	341	343	324	364	336	349	0.009
S2	295	257	331	280	301	295	270	324	286	303	0.364
T2	278	250	293	268	288	285	260	303	276	290	0.059
I2	279	244	318	262	288	288	267	312	277	294	0.091
N2	307	275	330	303	312	310	281	338	299	316	0.358
Inner retina	l layers (µn	n)									
C0	178	132	211	165	192	199	174	225	181	206	0.003
S1	256	219	292	234	262	262	246	283	254	270	0.015
T1	243	201	258	226	248	252	233	270	245	257	0.005
I1	254	217	308	240	258	261	237	284	253	265	0.013
N1	256	216	315	234	262	261	244	285	256	268	0.013
S2	218	181	254	202	222	218	199	247	210	225	0.363
T2	198	172	216	190	207	207	189	224	200	212	0.016
I2	201	169	241	191	211	210	193	235	202	218	0.019
N2	228	195	253	213	234	232	213	260	221	239	0.195
Outer retina	l layers (μι	n)									
C0	86	81	91	84	89	86	77	95	83	88	0.991
S1	80	75	91	79	82	80	75	85	78	82	0.437
T1	80	75	88	79	81	80	75	87	77	82	0.677
I1	79	74	85	78	81	80	74	86	77	81	0.955
N1	81	76	88	79	82	81	76	86	79	82	0.902
S2	78	71	83	76	80	79	73	83	77	80	0.848
T2	78	73	83	77	79	77	73	81	76	79	0.597
I2	76	70	82	74	78	77	72	80	74	78	0.744
N2	78	72	88	76	79	78	73	81	77	79	0.991

**Table 2**. Analysis of macular retinal thickness. Statistical significance was assessed using the Mann-Whitney U Test. Significant values appear in boldface. *AD* Alzheimer's disease, *HC* healthy control, *Min* minimum, *Max* maximum, *Q1* lower quartile, *Q2* upper quartile, *C0* central foveal thickness, *S1* inner superior, *N1* inner nasal, *I1* inner inferior, *T1* inner temporal, *S2* outer superior, *N2* outer nasal, *I2* outer inferior, *T2* outer temporal.

# Vessel density in the macular area

The AD group showed a decreased VD in the macular area compared to the HC group, along with an increased foveal avascular zone (FAZ) (p = 0.021). Significant changes in VD were observed in the DVP of the whole enface image (p = 0.030), as well as in the fovea (p = 0.004) and the perifoveal area (p = 0.012). Although no statistically significant changes were identified in SVP, the p-value for SVP in the fovea approached the significance threshold (p = 0.05) (Table 4).

# Areas under the receiver operating characteristic curves

The areas under the receiver operating characteristic curves (AUC) were calculated to evaluate the diagnostic capacity of these results in discriminating between AD and HC using the parameters with the most significant differences (AUC > 0.7). The highest AUC for individual macular layer thicknesses in the segmentation analysis were 0.79 (0.65–0.93) for the ONL in the S2 sector, 0.76 (0.62–0.88) for mean macular retinal thickness in the C0 sector, and 0.76 (0.62–0.90) in the T1 sector. For VD in individual plexuses, a value of 0.75 (0.61–0.89) was obtained for the foveal DVP (Fig. 1) (Supplementary Table 1).

# Spearman correlations

Table 5 presents the Spearman correlations between VD and the thickness of the corresponding retinal layers across the same study areas. For this analysis, VD in the SVP was correlated with the thickness of the retinal layers between the ILM and the outer boundary of the IPL, while VD in the DVP was correlated with the thickness of the retinal layers between the INL and the outer boundary of the OPL. Positive correlations were observed between the ILM-IPL in the foveal area and the VD measured in the corresponding SVP (R = 0.421; p = 0.005), between the INL-OPL in the foveal area and the VD measured in the corresponding DVP (R = 0.396;

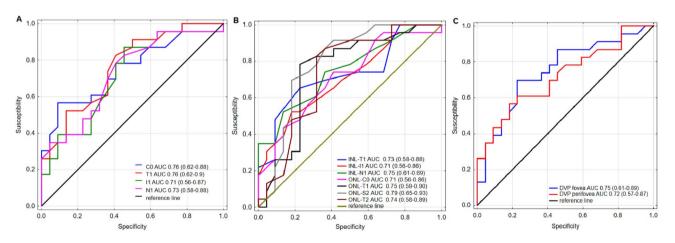
Papers   Paper   Papers   Pa		l . –										
Notation   Property   Property		AD					HC					
Column				Max	Q1	Q2	Median	Min	Max	Q1	Q2	p value
No.   No.			_	10	10	1.4	12	10	1.0	10	1.4	0.020
The color			-									
Name												
N1												
SS         40         29         83         36         43         88         29         54         35         42         0.04           T2         20         17         31         19         21         20         17         25         19         22         0.02           12         39         25         52         32         42         40         30         54         35         44         0.33           N2         48         30         10         16         15         11         24         13         19         0.025           S1         51         35         55         45         52         39         61         46         51         0.025           T1         45         30         81         48         47         35         66         42         51         0.025           S1         51         35         55         45         52         39         61         46         30         32           N1         50         38         62         41         51         50         36         42         30         30         30         30         30						-						
Part												
Name												
Ganglion cell layer (µm)           CO         12         8         20         10         16         15         11         24         13         19         0.025           S1         51         35         55         45         33         52         37         60         49         54         0.326           T1         45         31         56         38         48         47         36         49         54         0.321           N1         50         38         62         41         51         50         36         58         47         54         0.321           N1         50         38         62         41         31         31         36         33         26         42         32         38         0.321           12         33         19         46         31         38         35         28         46         32         38         0.53           12         33         19         41         31         38         35         32         46         32         38         45         40         43         42         43         42         43												
CO				75	43	54	49	34	63	46	53	0.339
S1         S1         S5         S4         S3         S2         S7         60         49         S4         C1         C1         C1         A5         S4         S2         S2         S5         S6         C2         C1         C1<			_		l		I					I
National Property						-						
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N1												
S2         34         24         39         31         36         33         26         42         32         37         0.91           T2         33         19         46         31         38         35         28         46         32         38         0.538           12         33         29         40         28         35         33         27         40         31         34         0.533           N2         37         29         41         32         39         36         30         44         34         39         0.991           Innerplexitum         37         29         41         32         37         42         42         35         49         38         44         0.78           T1         40         31         31         45         36         43         41         32         47         38         40         0.65           N1         41         34         62         37         42         41         32         47         34         40         43         0.65           N1         41         34         62         37         42         41												
T		50	38	62	41	51	50	36	58	47	54	0.321
Name	S2	34	24	39	31	36	33	26	42	32	37	0.991
N2		33		46	31	38	35		46	32	38	0.538
Name   Desire   Des	I2	33	22	40	28	35	33	27	40	31	34	0.553
CO	N2	37	29	41	32	39	36	30	44	34	39	0.991
S1         41         31         45         36         43         41         37         49         38         44         0.278           T1         40         31         44         37         42         42         35         45         39         43         0.10           11         40         34         53         37         42         41         32         47         38         43         0.465           N1         41         34         62         37         43         42         36         47         40         43         0.479           S2         27         22         31         24         29         27         21         33         26         29         0.783           T2         31         23         35         29         33         33         29         38         31         34         0.035           12         26         20         36         24         28         27         21         32         28         0.53         0.02           N2         28         22         31         7         21         32         38         0.20         0.02 <td>Inner plexifo</td> <td>orm layer (</td> <td>μm)</td> <td></td> <td></td> <td></td> <td></td> <td></td> <td></td> <td></td> <td></td> <td></td>	Inner plexifo	orm layer (	μm)									
T1	C0	19	14	27	17	21	22	17	28	19	24	0.047
N	S1	41	31	45	36	43	41	37	49	38	44	0.278
N1	T1	40	31	44	37	42	42	35	45	39	43	0.110
S2         27         22         31         24         29         27         21         33         26         29         0.783           T2         31         23         35         29         33         33         29         38         31         34         0.035           I2         26         20         36         24         28         27         21         32         25         28         0.530           N2         28         22         31         25         30         27         24         34         26         31         0.529           Inner nuclear layer (μπ)         V         V         22         23         14         31         19         26         0.027           S1         41         34         44         39         42         43         37         50         40         46         0.029           T1         37         26         42         33         41         39         34         46         0.029           T1         37         26         42         33         41         38         50         41         46         0.029           T1 <td>I1</td> <td>40</td> <td>34</td> <td>53</td> <td>37</td> <td>42</td> <td>41</td> <td>32</td> <td>47</td> <td>38</td> <td>43</td> <td>0.465</td>	I1	40	34	53	37	42	41	32	47	38	43	0.465
T2	N1	41	34	62	37	43	42	36	47	40	43	0.479
12   26   20   36   24   28   27   21   32   25   28   0.530   N2   28   22   31   25   30   27   24   34   26   31   0.529   Inner nuclear layer (μπ)	S2	27	22	31	24	29	27	21	33	26	29	0.783
N2	T2	31	23	35	29	33	33	29	38	31	34	0.035
Namer nuclear layer (μm)   Namer nuclear nuclear layer (μm)   Namer nuclear nuclear layer (μm)   Namer nuclear nuclear nuclear nuclear layer (μm)   Namer nuclear nucl	I2	26	20	36	24	28	27	21	32	25	28	0.530
CO         20         13         29         17         22         23         14         31         19         26         0.027           S1         41         34         44         39         42         43         37         50         40         46         0.029           T1         37         26         42         33         41         39         33         45         38         42         0.008           I1         39         32         47         36         43         43         36         53         41         48         0.015           N1         39         34         46         36         43         44         38         50         41         46         0.004           S2         30         28         35         29         31         31         29         43         30         33         0.196           T2         32         28         36         30         34         33         30         38         32         35         0.071           I2         30         26         45         28         32         32         29         36         30	N2	28	22	31	25	30	27	24	34	26	31	0.529
S1         41         34         44         39         42         43         37         50         40         46         0.029           T1         37         26         42         33         41         39         33         45         38         42         0.008           I1         39         32         47         36         43         43         36         53         41         48         0.015           N1         39         34         46         36         43         44         38         50         41         46         0.004           S2         30         28         35         29         31         31         29         43         30         33         0.196           T2         32         28         36         30         34         33         30         38         32         35         0.071           I2         30         26         45         28         32         32         29         36         30         33         0.036           N2         33         30         37         31         34         33         30         38         32	Inner nuclea	ır layer (μn	n)									
T1 37 26 42 33 41 39 33 45 38 42 0.008  I1 39 32 47 36 43 43 36 53 41 48 0.015  N1 39 34 46 36 43 44 38 50 41 46 0.004  S2 30 28 35 29 31 31 29 43 30 33 0.196  T2 32 28 36 30 34 33 30 38 32 35 0.071  I2 30 26 45 28 32 32 29 36 30 33 0.036  N2 33 30 37 31 34 33 30 38 32 35 0.124  Outer plexiform layer (μm)  C0 24 15 44 22 29 27 20 44 25 30 0.124  S1 33 26 52 29 39 31 27 51 28 36 0.399  T1 30 24 41 27 32 31 23 40 27 32 0.954  I1 34 24 53 28 38 35 26 53 31 38 0.473  N1 34 26 62 30 40 35 25 57 28 38 0.964  S2 27 24 33 25 28 26 23 32 25 57 28 38 0.964  S2 27 24 33 25 28 26 29 26 24 30 26 28 0.554  I2 27 23 33 25 29 28 26 24 30 26 29 26 24 30 26 28 0.554  I2 27 23 33 25 29 28 24 34 26 29 0.286  N2 29 25 37 27 31 29 25 41 27 30 0.936  Outer nuclear layer (μm)	C0	20	13	29	17	22	23	14	31	19	26	0.027
N1   39   32   47   36   43   43   36   53   41   48   0.015     N1   39   34   46   36   43   44   38   50   41   46   0.004     S2   30   28   35   29   31   31   29   43   30   33   0.196     T2   32   28   36   30   34   33   30   38   32   35   0.071     I2   30   26   45   28   32   32   29   36   30   33   0.036     N2   33   30   37   31   34   33   30   38   32   35   0.124     Outer plexiform layer (μm)     C0   24   15   44   22   29   27   20   44   25   30   0.124     S1   33   26   52   29   39   31   27   51   28   36   0.399     T1   30   24   41   27   32   31   23   40   27   32   0.954     I1   34   24   53   28   38   35   26   53   31   38   0.473     N1   34   26   62   30   40   35   25   57   28   38   0.964     S2   27   24   33   25   28   26   23   32   25   27   0.389     T2   28   24   30   26   29   26   24   30   26   28   0.554     I2   27   23   33   25   29   28   24   34   26   29   0.286     N2   29   25   37   27   31   29   25   41   27   30   0.936     Outer nuclear layer (μm)     C0   91   70   110   80   97   96   80   108   91   105   0.015     S1   65   35   76   56   71   71   50   78   64   76   0.038     T1   71   57   82   64   72   77   46   94   73   80   0.005     I1   62   39   83   54   67   63   44   93   56   74   0.388     T1   71   57   82   64   72   77   46   94   73   80   0.005     T1   71   57   82   64   72   77   46   94   73   80   0.005     T1   71   57   82   64   72   77   46   94   73   80   0.005     T1   71   57   82   64   72   77   46   94   73   80   0.005     T1   71   57   82   64   72   77   46   94   73   80   0.005     T1   71   57   82   64   72   77   46   94   73   80   0.005     T1   71   57   82   64   72   77   77   46   94   73   80   0.005     T1   T1   57   82   64   72   77   46   94   73   80   0.005     T1   T1   57   82   64   72   77   46   94   73   80   0.005     T1   T1   57   82   64   72   77   46   94   73   80   0.005     T1   T1   50   78   74   74   74   74   74   74   74	S1	41	34	44	39	42	43	37	50	40	46	0.029
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I1         62         39         83         54         67         63         44         93         56         74         0.388												
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Continued		62	39	83	54	67	63	44	93	56	/4	0.388
	Continued											

	AD		НС								
Parameter	Median	Min	Max	Q1	Q2	Median	Min	Max	Q1	Q2	p value
N1	65	47	81	56	72	71	44	89	65	76	0.122
S2	54	45	63	50	58	62	45	69	57	65	0.001
T2	53	42	62	50	55	59	43	68	53	63	0.007
I2	47	41	56	42	51	49	39	61	46	57	0.122
N2	52	41	65	46	55	52	43	67	51	60	0.101

**Table 3.** Individual macular layer thicknesses in segmentation analysis. Statistical significance was assessed using the Mann-Whitney U Test. Significant values appear in boldface. *AD* Alzheimer's disease, *HC* healthy control, *Min* minimum, *Max* maximum, *Q1* lower quartile, *Q2* upper quartile, *C0* central foveal thickness, *S1* inner superior, *N1* inner nasal, *I1* inner inferior, *T1* inner temporal, *S2* outer superior, *N2* outer nasal, *I2* outer inferior, *T2* outer temporal.

	AD	НС									
Parameter	Median	Min	Max	Q1	Q2	Median	Min	Max	Q1	Q2	p value
Vessel density	Vessel density										
SVP whole (%)	48	39	56	43	49	49	41	55	45	51	0.149
SVP fovea (%)	19	8	31	15	24	22	14	38	20	26	0.050
SVP parafovea (%)	50	36	59	45	53	52	39	58	49	54	0.224
SVP perifovea (%)	48	39	55	44	50	49	42	56	46	52	0.078
DVP whole (%)	46	37	54	40	49	49	39	64	45	51	0.030
DVP fovea (%)	35	21	46	30	38	40	28	48	37	43	0.004
DVP parafovea (%)	52	43	58	49	56	53	47	62	51	54	0.625
DVP perifovea (%)	45	36	55	40	50	50	40	65	47	52	0.012
FAZ (mm <sup>2</sup> )	0.3	0.1	0.5	0.2	0.4	0.2	0.1	0.5	0.2	0.3	0.021

**Table 4**. Retinal vessel density in optical coherence tomography angiography among study groups. Statistical significance was assessed using the Mann-Whitney U Test. Significant values appear in boldface. *AD* Alzheimer's disease, *HC* healthy control, *Min* minimum, *Max* maximum, *Q1* lower quartile, *Q2* upper quartile, *SVP* superficial vascular plexus, *DVP* deep vascular plexus, *FAZ* foveal avascular zone.



**Fig. 1.** Areas under the receiver operating characteristic curves for differentiating between Alzheimer's disease patients and healthy control subjects. (**A**) Mean macular retinal thickness. (**B**) Individual macular layer thicknesses in the segmentation analysis. (**C**) vessel density in the deep vascular plexus.

	Spearman coefficients				
Parameter		R value	p value		
ILM-IPL fovea	SVP fovea	0.421	0.005		
ILM-IPL parafovea	SVP parafovea	0.243	0.107		
ILM-IPL perifovea	SVP perifovea	0.388	0.008		
INL-ONL fovea	DVP fovea	0.396	0.007		
INL-ONL parafovea	DVP parafovea	0.241	0.111		
INL-ONL perifovea	DVP perifovea	0.221	0.145		

**Table 5**. Spearman correlations between retinal layer thickness and vessel density in the study groups. Relationship was assessed using the Spearman Rang Order Correlations Test. Significant values appear in boldface. *ILM* internal limiting membrane, *IPL* inner plexiform layer, *ONL* outer nuclear layer, *SVP* superficial vascular plexus, *DVP* deep vascular plexus.

p = 0.007), and between the ILM-IPL in the perifoveal area and the VD measured in the corresponding SVP (R = 0.388; p = 0.008).

#### Discussion

The results of our study offer valuable insights into the thickness of individual retinal layers and vascular changes in the macula, highlighting their potential as diagnostic markers for AD. Although some studies have investigated the thickness of retinal layers in the macula of patients with AD, further research is necessary to assess individual retinal layers and their corresponding vascular plexus.

The strength of this study comes from its focus on the analysis of individual retinal layers in the macula, allowing for a precise assessment of areas affected by pathological processes in eyes with AD. In our previous study utilizing the Avanti SD-OCT device, we demonstrated that the most significant changes in retinal thickness in AD patients were observed in the ORL, which extend from the INL to the outer RPE<sup>18</sup> Building on this knowledge, our current study employing Spectralis SD-OCT technology reveals that the most pronounced changes occur in the INL and ONL, reinforcing our earlier observations that classified the retina solely into IRL and ORL. Additionally, we quantitatively assessed VD in specific macular regions by analyzing both the SVP and the DVP. This approach enabled us to correlate the thickness of individual retinal layers with their corresponding vascular plexuses in specific areas of the macula.

We confirmed that AD patients have a thinner mean retinal thickness in the macula compared to the HC group, and the greatest differences were observed in the central retinal thickness (C0) and in individual sectors (T1, S1, I1, N1) where the highest number of retinal ganglion cells (RGCs) are located. The changes in the retina may reflect the underlying neurodegenerative processes associated with AD. These results are consistent with previous studies that have indicated RGCs degeneration as an important marker of AD pathology<sup>21,22</sup>.

The degeneration of ganglion cells and their axonal and dendritic projections to the retina may be the result of premature apoptotic processes, probably related to the accumulation of  $A\beta$  and tau proteins<sup>23,24</sup>. As AD progresses, it can be assumed that the structural abnormalities of the retina, especially its IRL, are thought to reflect pathological changes occurring in the brain, which may facilitate the identification of AD in its early stages<sup>25</sup>.

In contrast to the IRL, the results regarding the thickness of the ORL did not show significant differences between the groups (p>0.05). This observation suggests that retinal changes in AD patients may be more pronounced in the IRL, reflecting more advanced degenerative processes. Such differences may be consistent with other studies that have shown that the thickness of the ORL is less sensitive to AD-related changes, in contrast to the IRL<sup>26</sup>. The decrease in IRL thickness may reflect more critical pathophysiological processes related to neuronal damage and degenerative dynamics in the brain<sup>27</sup>.

Another important finding was the change in INL thickness. The mean values of the INL thickness in sectors C0, S1, T1, I1, N1, and I2 revealed significant differences between the groups, which may indicate severe damage to this layer as a result of neurodegeneration. This is particularly important as the INL is an area of the neuron in the retina that is associated with the synaptic network, which may be crucial in the context of signal transmission and overall retinal function<sup>28,29</sup>.

An equally important finding was the change in ONL thickness. The mean values of the ONL thickness showed significant differences between the groups, indicating severe damage as a result of neurodegeneration. The ONL layer is crucial for the function of the photoreceptor cells, which are responsible for vision and image processing<sup>29</sup>. In the context of AD, Santos et al. suggests that the loss of the ONL may indicate retrograde transsynaptic degeneration and that changes in the thickness of this layer may be important for the overall function of the retina and its ability to process visual information<sup>30</sup>.

In line with our findings concerning the most pronounced changes in the IRL of the retina, recent electrophysiological studies have shown impairments in the function of RGCs and subtle alterations in photoreceptors in patients with AD. Reduced amplitudes of electroretinograms (ERG) have been linked to dysfunction in the IRL particularly in RGCs, suggesting a potential loss of function that may correlate with disease severity<sup>31,32</sup>. These electrophysiological changes provide additional support for the hypothesis that retinal degeneration in AD may reflect the neurodegenerative processes occurring in the brain. Furthermore,

histological analyses have confirmed these findings, revealing significant loss of both RGCs and photoreceptors, as well as bipolar cells, in the retinas of individuals with  $\mathrm{AD^{33}}$ . Such histological evidence strengthens the notion that the retina can serve as a valuable window into the neurodegenerative processes affecting the central nervous system.

In addition to assessing retinal layer thickness, our study confirmed significant reductions in VD, particularly in the DVP, and an increased FAZ in patients with AD compared to HC, which is consistent with previous studies<sup>20,34</sup>. These findings are particularly intriguing and suggest that vascular changes may occur concomitantly with neurodegenerative changes<sup>35</sup>. Reduced VD and integrity may reflect underlying brain microvascular dysfunction in the brain, which has been implicated in the pathophysiology of AD. Vascular dysregulation, characterized by amyloid angiopathy and neuronal cell death, may contribute to the progressive nature of AD<sup>36,37</sup>. Previous studies have emphasized the importance of ocular perfusion in maintaining retinal and nerve fibre health, and our results support the importance of vascular assessment in diagnostic procedures for suspected AD<sup>38,39</sup>.

Spearman correlation results reveal positive associations between retinal layer thickness and VD. This suggests that structural changes in the retina may be related to the overall vascular status, underlining the importance of retinal assessment as a potential indicator of pathophysiological changes in AD. These correlations suggest a reciprocal relationship between neurodegeneration and vascular health, reinforcing the need for comprehensive assessments that include both retinal thickness and VD measurements to improve diagnostic capabilities. Such correlations may point to mechanisms that protect neuronal cells in the context of neurodegenerative diseases.

The AUC analysis confirms that retinal layer thickness and changes in VD may be useful as diagnostic biomarkers in AD. The highest AUC values were obtained for ONL thickness in the S2 sector and macular retinal thickness in the central sector, raising hopes for the use of non-invasive methods such as SD-OCT and OCTA in clinical practice.

# Limitations

Despite the promising results, our study has limitations. The sample size was modest and, although we observed significant differences, future studies with larger cohorts are needed to confirm our results and to clarify the potential of these retinal markers in the clinical setting. Furthermore, longitudinal studies are necessary to clarify the relationship between changes in retinal parameters and the progression of AD symptoms over time. It is also important to consider other potential confounding factors that affect retinal morphology and vascular status. For example, changes in overall vascular health may affect retinal outcomes and need to be included in future studies. Additionally, while we acknowledge the importance of vascular and metabolic factors, the lack of detailed data on blood pressure and blood glucose levels should be recognized as a limitation.

#### **Conclusions**

In conclusion, our study demonstrates that evaluation of changes in specific layers of macular retinal thickness and VD may be significant diagnostic indicators for AD. These non-invasive measurements may improve early detection and monitoring of the disease and may be a valuable adjunct to conventional diagnostic methods. Further research is needed to understand the mechanisms behind these changes and to develop standardized protocols for incorporating retinal assessments into the clinical diagnosis of AD.

# Materials and methods Study subjects

This cross-sectional study was conducted from 2017 to 2022 at the Oftalmika Eye Hospital in Bydgoszcz, Poland. The protocol of the study was approved by the Bioethical Commission of Nicolaus Copernicus University in Torun, Collegium Medicum in Bydgoszcz, and all participants provided signed informed consent. The study was conducted in accordance with the Helsinki Declaration, and participants were fully informed about the nature of the study and its potential consequences before providing their consent.

Each individual included in the study underwent a cognitive function assessment by a psychologist using the MMSE screening test. All patients underwent a comprehensive ophthalmological examination, including measurement of BCVA with Snellen charts, tonometry (Icare TAO1i, Finland Oy, Vantaa, Finland), fundus evaluation with a Volk lens, biomicroscopy, measurement of retinal structures using SD-OCT, and evaluation of VD with OCTA. The visual acuity measured with Snellen charts was subsequently converted into the logarithm of the minimum angle of resolution (logMAR) for statistical analysis. These examinations were conducted by an ophthalmologist in a single session.

A group of AD patients were referred from the Center for Psychoneurology of the Elderly in Bydgoszcz and the Department of Psychiatry of the Collegium Medicum of the Nicolaus Copernicus University in Bydgoszcz. A diagnosis of AD was made by a psychiatrist based on the guidelines of the National Institute on Aging and the Alzheimer's Association and the criteria of the Diagnostic and Statistical Manual of Mental Disorders (DSM-IV). The diagnosis was confirmed by neuroimaging, which showed the presence of amyloid plaques in the brain using positron emission tomography (PET) with the radioligand Florbetapir (18 F). Patients were classified as amyloid-positive if their neocortex standardized uptake value ratio was greater than 1.5. Patients with mild to moderate dementia (MMSE scores between 10 and 23) were eligible for inclusion in the study. Other criteria included normal intraocular pressure (IOP)  $\leq$  21 mmHg and the absence of fundus changes suggestive of retinal or optic nerve diseases (e.g., AMD or glaucoma).

Members of the Senior Club in Bydgoszcz formed the HC group. After giving their consent, they underwent comprehensive ophthalmological and psychological assessments. To be included in the control group, participants had to have a normal MMSE score ( $\geq 27$  points), no evidence of any eye or neurodegenerative diseases.

Exclusion criteria included those younger than 55 years or older than 87 years, those with BCVA less than 0.6, refractive errors greater than +3.0 Dsph or less than -3.0 Dsph, and a history of eye surgery other than uncomplicated cataract phacoemulsification. The study also excluded individuals with any eye diseases (defined as those identified through a comprehensive ophthalmological examination, SD-OCT assessment, and patient interview) or neurodegenerative diseases (except for Alzheimer's disease confirmed by PET scan), which were defined based on psychological assessment and patient interview. Additionally, individuals with a history of head or eye trauma, increased IOP (>21 mmHg), diabetes, uncontrolled hypertension (greater than 150/90 mm Hg), obesity (body mass index over 30 kg/m²), and smoking were excluded from the study.

#### Optical coherence tomography angiography

OCTA imaging was conducted using the Avanti RTVue XR (Optovue, Inc., Fremont, CA, USA), which scans at a rate of 70.000 A-scans per second and provides an axial resolution of 5  $\mu$ m with a light source wavelength of 840  $\pm$  10 nm. A system (software version 2017.1.0.151) with featuring three-dimensional Projection Artifact Removal (3D PAR) was used, which effectively reduces projection artifacts in all deeper layers while preserving their authentic layout and improving the FAZ parameters.

The macula was analyzed using B-scans covering a area of  $6 \times 6$  mm², scanned both vertically and horizontally. Each B-scan consisted of 400 A-scans centered on the fixation point. Macular VD was assessed across the  $6.0 \times 6.0$  mm² area, within the 1-mm diameter foveal annulus, the parafoveal area between the 1-mm and 3-mm annuli, and the perifoveal area. Data were processed using commercial software that automatically segmented the SVP and DVP and measured the VD in both plexuses. The SVP comprised the area between the ILM and the outer boundary of the IPL, while the DVP comprised the area between the outer boundary of the IPL and the outer boundary of the OPL.

Both eyes of all participants were examined on the same day between 8:00 AM and 12:00 PM following pupil dilation. Only measurements of high technical standard, with a scan quality (SQ) of 6 or above on a 10-point scale (as indicated by the commercial camera), were included in further analysis. Measurements showing motion artifacts on the en face images, such as irregular vessel patterns or blurred images, were excluded.

# Spectral-domain optical coherence tomography

The retinal structure analysis was conducted using the Spectralis SD-OCT device (Heidelberg Engineering GmbH, Heidelberg, Germany), equipped with real-time eye-tracking software (Heidelberg Eye Explorer, version 1.10.4.0). Each participant was scanned in IR+OCT mode with a 30° area setting. The acquired volumes consisted of 61 images, each measuring of  $768 \times 496$  pixels (width × height). The axial resolution was 3.9 microns, and the transversal resolution ranged from 10 to 12 microns. Importantly, high-resolution (HR) scans were utilized to ensure optimal image clarity and precision. The spacing between B-scans varied from 120 to 140 microns. To reduce speckle noise and improve image contrast, each B-scan was averaged from five aligned images using TruTrack active eye tracking technology.

The Spectralis software provided thickness measurements for several retinal layers, including: (1) mean macular retinal thickness, (2) mRNFL, (3) GCL, (4) IPL, (5) INL, (6) OPL, (7) ONL, (8) retinal pigment epithelium (RPE), (9) IRL—defined as the area from the ILM to the external limiting membrane (ELM), and (10) ORL—defined as the area from the ELM to Bruch's membrane (Fig. 2).

After the automatic segmentation of each slice, the Spectralis software provides thickness maps divided into nine subfields as defined by the ETDRS. Inner, intermediate, and outer rings with diameters of 1, 3, and 6 mm respectively, were considered for the analysis. The average of all points within the inner 1-mm radius circle was defined as central foveal thickness (C0). The intermediate ring was divided into four sectors designated as inner superior (S1), inner nasal (N1), inner inferior (I1), and inner temporal (T1); and so was the outer ring, with four sectors designated as outer superior (S2), outer nasal (N2), outer inferior (I2), and outer temporal (T2). The numerical values recorded for each of the nine zones for every layer were used in the analysis.

The same experienced operator performed all scans, and no manual correction was applied to the SD-OCT output. The quality of the scans was assessed on a scale ranging from 0 (poor) to 40 (high), and scans scoring lower than 25, as well as those exhibiting incorrect segmentation, were discarded.

# Statistical analysis

Statistical analyses were performed using Statistica Software (ver. 14; TIBCO Software Inc.). First of all, the data were compared between the eyes as no significant difference was found, further analyses were performed on the one eye (the right eye) of each participant. The Shapiro-Wilk test showed that the data sets were far from a normal distribution, so nonparametric tests were used for farther analyses. The median, minimum (Min), and maximum (Max) values, along with the lower (Q1) and upper (Q2) quartiles, were calculated. Among the groups, OCTA and SD-OCT data were compared by using the Mann-Whitney U Test. Correlations between measured parameters were assessed using the Spearman rang order correlations test.

The AUC was used to determine the diagnostic accuracy of the measured parameters in discriminating between AD and HD groups. The AUC of 1.0 represents perfect discrimination, a value of 0.7 or higher represents acceptable discrimination, whereas an AUC of 0.5 represents chance discrimination. Differences were considered significant if the *p*-value was equal to 0.05 or less.

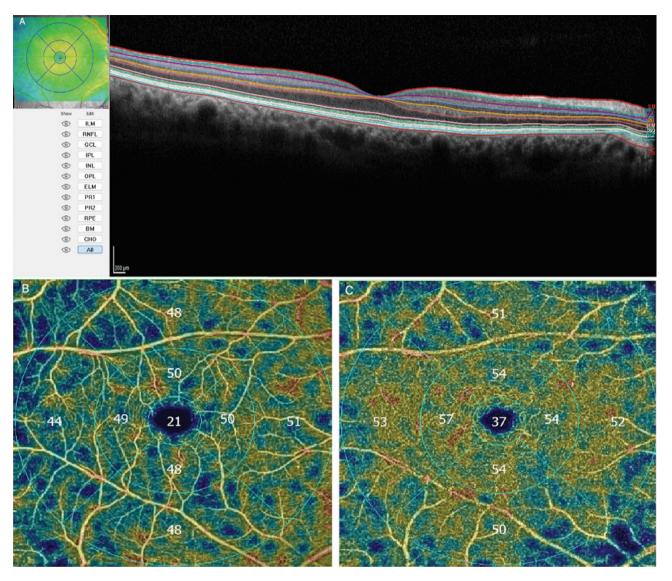


Fig. 2. Sample results of the study for the right eye of a 78-year-old patient with Alzheimer's disease. (A) Retinal thickness maps divided into nine subfields as defined by the Early Treatment Diabetic Retinopathy Study (ETDRS), along with retinal layer segmentation in spectral domain optical coherence tomography. Layers: internal limiting membrane (ILM), retina nerve fiber layer (RNFL), ganglion cell layer (GCL), inner plexiform layer (IPL), inner nuclear layer (INL), outer plexiform layer (OPL), external limiting membrane (ELM), photoreceptor layer (PR), retina pigment epithelium (RPE), Bruch membrane (BM). (B) Superficial vascular plexus with qualitative and quantitative assessments of vessel density, divided into nine subfields as defined by the ETDRS. (C) Deep vascular plexus with qualitative and quantitative assessments of vessel density, divided into nine subfields as defined by the ETDRS.

# Data availability

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

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Conception and design: P.Z., K.Z., J.J.K. Development of methodology: P.Z., J.J.K., R.K. Data acquisition: D.J., K.S., M.G-T. Analysis and interpretation of data: P.Z., A.P-K. Statistic Review: A.P-K. Writing, review of manuscript: all authors.

# **Declarations**

## Competing interests

The authors declare no competing interests.

#### Additional information

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