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- 1 Associations between Retinal Microvascular Flow, Geometry, and Progression of
- 2 Diabetic Retinopathy in Type 2 Diabetes: A 2-Year Longitudinal Study
- 3
- 4 Running title: Retinal microvasculature and DR progression
- 5
- 6 **Authors:** Yi Wu, MD¹, Minghuang He, MD, PhD², Wenyong Huang, MD, PhD¹, Wei
- 7 Wang, MD, PhD¹
- 8

9 Affiliation and institute

- 10 1. State Key Laboratory of Ophthalmology, Zhongshan Ophthalmic Center, Sun Yat-
- 11 sen University, Guangdong Provincial Key Laboratory of Ophthalmology and
- 12 Visual Science, Guangdong Provincial Clinical Research Center for Ocular
- 13 Diseases, Guangzhou, China.
- 14 2. Research Centre for SHARP Vision, The Hong Kong Polytechnic University, Hong
- 15 Kong, China.
- 16

17 Corresponding authors

- 18 Wei Wang, MD & PhD, State Key Laboratory of Ophthalmology, Zhongshan
- 19 Ophthalmic Center, Sun Yat-sen University, Guangzhou, China.
- 20 Email: wangwei@gzzoc.com
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26 Abstract

Purpose: To determine the association between retinal blood vessel flow and
 geometric parameters, and the risk of diabetic retinopathy (DR) progression through
 a 2-year prospective cohort study.

Methods: Patients with type 2 diabetes mellitus (T2DM) were recruited from a 30 31 diabetic registry between November 2017 and March 2019. All participants 32 underwent standardized examinations at the baseline and 2-year follow-up visit, and the presence and severity of DR was assessed based on standard seven-field color 33 fundus photographs. They also underwent swept-source optical coherence 34 tomography angiography (OCTA) imaging to obtain measurements of foveal 35 avascular zone (FAZ) area, blood vessel density (VD), fractal dimension (FD), blood 36 vessel tortuosity (BVT) in the superficial capillary plexus (SCP) and deep capillary 37 38 plexus (DCP). **Results:** A total of 233 eyes of 125 patients were included, and 40 eyes (17.17%) 39 experienced DR progression within 2 years. DR progression was significantly 40 associated with lower baseline VD (odds ratio [OR], 2.323 per SD decrease; 95% 41 confidence interval [CI], 1.456-3.708; P<0.001), lower FD (OR, 2.484 per SD decrease; 42 95% CI, 1.268-4.867; P=0.008), and higher BVT (OR, 2.076 per SD increase; 95% CI, 43 44 1.382-3.121; P<0.001) of the DCP after adjusting for confounding factors. The addition of OCTA metrics improved the predictive ability of the original model for DR 45 progression (area under the curve [AUC], from 0.725 to 0.805; P=0.022). 46 **Conclusions:** OCTA-derived VD, FD and BVT in the DCP were independent predictors 47 of DR progression and showed additive value when added to established risk models 48 predicting DR progression. 49

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Keywords: OCTA, disease progression, diabetic retinopathy, longitudinal, cohort

53 Introduction

Diabetic retinopathy (DR) is the leading cause of avoidable blindness in adults aged 54 20-74 years[1]. The early detection and management of DR can substantially reduce 55 the risk of visual impairment and blindness. Currently, the identification of 56 populations likely to experience DR progression is still challenging. This is because 57 58 established risk factors, such as duration of diabetes, glucose control, lipid profiles, 59 and blood pressure are insufficient for predicting DR progression[2, 3]. The identification of novel predictors for DR progression will aid in implementing 60 preventative intervention strategies and more frequent follow-up visits for high-risk 61 populations. Recently, novel factors encompassing nutrients, genetics, and 62 epigenetics have been explored and confirmed to be associated with the 63 mechanisms of DR and capable of predicting the progression of DR[4, 5]. Exploration 64 65 of potential factors would allow health professionals to better control DR at the population level and reduce morbidity and the quality of life losses that result from 66 67 vision impairment.

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Optical coherence tomography angiography (OCTA) enables the in vivo visualization 69 and quantification of the retinal microvasculature, thus allowing the detection of 70 71 vascular alterations in the superficial capillary plexus (SCP) and deep capillary plexus (DCP) [6, 7]. Chronic hyperglycemia is known to cause ischemia and vessel 72 remodeling in the retinal microvasculature, implying that such vascular regions are 73 74 likely to be involved in DR. Several cross-sectional studies have been conducted on OCTA flow metrics, including the vessel density (VD) and foveal avascular zone (FAZ). 75 These metrics showed significant alterations in diabetic eyes without clinical 76 indications of DR, indicating their underlying prognostic value for DR progression[8]. 77 However, recent longitudinal studies have yielded inconsistent results[7, 9, 10]. 78 79

The analysis of microvascular geometry provides valuable information about the quality of vascular networks and quantifies deviations from normal retinal vascular networks that indicate vascular impairment. Fractal dimension (FD) and blood

vascular tortuosity (BVT) are sensitive OCTA metrics for the diagnosis of proliferative
DR (PDR) [11, 12]. Nonetheless, the prognostic value of FD has been questioned, and
the efficiency of BVT in predicting DR progression has yet to be evaluated[6, 7]. To fill
this gap, the aim of this study was to determine the value of retinal flow and
geometry for predicting DR progression based on the prospective cohort.

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89 Methods

90 Participants

This prospective cohort study (ISRCTN registry no.15853192) was performed at the
Zhongshan Ophthalmic Center (ZOC), Sun Yat-sen University, Guangzhou, China. It
adhered to the tenets of the Declaration of Helsinki and was approved by the
Institutional Ethics Committee of ZOC (2017KYPJ094). Written informed consent was
obtained from all participants.

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Patients with type 2 diabetes mellitus (T2DM) aged 35-80 years were recruited from
the Guangzhou Community Diabetic Registry from November 2017 to March 2019
and followed up annually[13, 14]. The baseline inclusion criteria were as follows: (1)
mild or moderate non-PDR confirmed by seven-field fundus images and OCT
imaging; (2) no history of ocular treatment (ocular treatment naïve); (3) bestcorrected visual acuity (BCVA) of 0.1 or better; and (4) spherical degree of > -6
diopters, astigmatism of < 1.5 diopters, and axial length (AL) of < 26.0 mm.

Participants were excluded under the following circumstances: (1) a history of 105 serious systemic diseases, such as ischemic heart disease, stroke, malignant tumor, 106 or nephropathy; (2) the inability to consent or cooperate with examinations; (3) a 107 history of major intervention, such as coronary bypass or renal dialysis; (4) eye 108 109 diseases other than DR, such as glaucoma, age-related macular disease, vitreous 110 macular diseases, or amblyopia; (5) a history of intraocular surgery, laser therapy, or intravitreal injection; (6) the presence of ocular media opacity, corneal ulcer, or 111 contraindications of mydriasis, such as shallow anterior chamber; (7) a history or 112

presence of diabetic macular edema (DME); and (8) severe non-PDR or PDR.

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115 Assessment of DR Progression

At baseline and follow-up visits, standard seven-field color fundus photographs 116 conforming to the Early Treatment Diabetic Retinopathy Study (ETDRS) criteria were 117 taken with a digital retinal camera (Canon CR-2, Tokyo, Japan) after pharmacological 118 119 pupil dilation. One retinal specialist blinded to the general patient information and OCTA images assessed the presence and severity of DR based on the retinal images 120 according to the modified ETDRS severity scale, which uses a 15-step DR severity 121 scale. DR was considered present when the retinopathy level was \geq 14. Furthermore, 122 the DR severity was stratified into mild NPDR (level 14-35), moderate NPDR (level 43-123 47), severe NPDR (level 53), and PDR (level \geq 60). DR progression was defined as a \geq 124 125 two-step increase within the ETDRS severity scale at the 2-year follow-up visit compared with baseline[15, 16]. 126

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128 Measurement of OCT Angiography Metrics

We adopted a commercial swept-source OCTA (SS-OCTA) (DRI-OCT-2 Triton; Topcon 129 Inc., Tokyo, Japan) device equipped with a tunable laser with a central wavelength of 130 131 1,050 nm, an acquisition speed of 100,000 A-scans/s, and an axial and lateral resolution of 7 and 20 μ m in tissue to perform 3 × 3 mm² macula-centered Angio 132 scans with 320 A-scans × 320 B-scans density. Motion artifacts and projection 133 artifacts were removed by a built-in eye tracker system and an artifact removal 134 algorithm. The built-in software (IMAGEnet 6, v1.24) automatically segmented the 135 scans into SCP and DCP with concurrent removal of the projection artifacts of the 136 DCP. The SCP layer was defined as 2.6 µm below the internal limiting membrane 137 (ILM) to 15.6 µm below the junction between the inner plexiform layer (IPL) and the 138 139 INL (IPL/INL), whereas the DCP layer was defined as 15.6 μ m below the IPL/INL to 140 70.2 µm below the IPL/INL. Two experienced investigators reviewed the segmentations and manually adjusted them if necessary. 141

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143 Ineligible images were excluded according to the following criteria: (1) image quality score (IQS)<50; (2) blurry images that prevented distinguishing the fine capillary 144 networks from the background signal; (3) residual motion artifacts; (4) local weak 145 signal or shadowing artifacts; (5) incorrect segmentation of the retinal layers; (6) 146 signal loss; (7) poor central fixation; and (8) uncompensated projection artifacts on 147 DCP. Eligible OCTA images from each participant were adjusted for the magnification 148 149 factor based on AL according to Littmann's formula and Bennett's method. All images were manually centered at the fovea, standardized, and subsequently 150 analyzed using the Fiji software (National Institutes of Health, Bethesda, MD, USA) 151 for quantitative metrics, including the parafoveal VD, FD, and BVT in the SCP and DCP 152 layers (Figure 1) [11, 17-20]. The FAZ area was measured based on the en face 153 images of the full-thickness retinal slab. 154

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156 Assessment of Other Risk Factors

157 Baseline general information, including age, sex, duration of diabetes, and medical history data, was collected through standardized interview-administered 158 questionnaires using fixed questions and answer options to ensure comparability 159 and consistency of survey results. Body height, weight, systolic blood pressure (SBP), 160 161 and diastolic blood pressure (DBP) were measured by nurses. Fasting venous blood and urine samples were obtained for the following laboratory parameters: glycated 162 hemoglobin (HbA1c), total cholesterol, high-density lipoprotein cholesterol (HDL-c), 163 low-density lipoprotein cholesterol (LDL-c), triglyceride, serum creatinine, C-reactive 164 protein (CRP), and microalbuminuria (MAU). All participants underwent 165 comprehensive ophthalmic examinations, including slit-lamp biomicroscopy (BQ-900, 166 Haag-Streit, Switzerland), visual acuity test by ETDRS LogMAR E charts (Precision 167 Vision, Villa Park, IL), refraction by an autorefractor (Topcon KR8800, Topcon 168 169 Corporation, Tokyo, Japan), and the measurement of intraocular pressure (IOP) by a 170 non-contact tonometer (Topcon CT-80A, Topcon, Tokyo, Japan). The AL was obtained using optical low-coherence reflectometry (Lenstar LS900; Haag-Streit AG, 171 Koeniz, Switzerland). 172

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174 Statistical Analysis

Statistical analysis was performed using Stata (version 17.0, Stata Corp., College 175 Station, TX, USA). The Kolmogorov-Smirnov test confirmed the normality of the 176 continuous variables, which were reported as the mean and standard deviation (SD). 177 We performed the Student's t-test and chi-square test for the continuous variables 178 179 and categorical variables, respectively, to compare baseline characteristics between participants with and without DR progression. Univariable and multivariable logistic 180 analyses were performed to investigate the association between the baseline OCTA 181 metrics and DR progression using generalized estimated equations (GEE) to account 182 for the inter-eye correlation in individual participants. The established risk factors for 183 DR progression, as detailed by Sun et al.[6] were integrated and adjusted in the 184 185 multivariable model. These included age, duration of diabetes, HbA1c level, mean arterial blood pressure, and DR severity at baseline. The receiver operating 186 187 characteristic (ROC) curves examined the incremental value of adding significantly associated OCTA metrics to the original DR prediction model to assess the added 188 value of these parameters. A p-value less than 0.05 was considered be statistically 189 significant. 190

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192 Results

Baseline Characteristics of Included Participants

194 Initially, this study included 286 eligible eyes from 153 patients with T2DM at

195 baseline. We excluded 53 eyes (28 patients) owing to loss to follow-up,

unsatisfactory image quality, or missing data. The excluded patients had higher

- 197 HbA1c, lower total cholesterol and HDL-c levels (Supplementary table 1). Eventually,
- a total of 233 eyes from 125 patients were included in the analysis, and 40 eyes
- (17.17%) presented DR progression within 2 years. **Table 1** summarizes the baseline
- demographic and clinical characteristics of included patients. Of them, 54.94%
- 201 patients were women, with the average age of 64.4±6.3 years and the average
- disease duration of 13.2±7.5 years. **Table 2** displays the quantitative measurements

- of baseline OCTA metrics stratified by DR status. The BMI, SBP, DBP, and MAP had
- decreasing trend during follow-up (**Supplementary table 2**). However, the HbA1c
- increased from 7.61 (1.43) at baseline to 8.17 (1.58) at 2-year follow-up (P<0.001).
- The reduced perfusion and impaired geometry were correlated with higher CMT, but
- 207 only FD in DCP arrived at significance (Supplementary table 3).
- 208

209 Association of OCTA Metrics and the Risk of DR Progression

- 210 **Table 3** shows the associations between baseline OCTA metrics and DR progression.
- After adjusting for other established factors, lower VD (OR, 2.323 per SD decrease;
- 212 95% CI, 1.456-3.708; P<0.001), lower FD (OR, 2.484 per SD decrease; 95% CI, 1.268-
- 4.867; P=0.008), and higher BVT (OR, 2.076 per SD increase; 95% CI, 1.382-3.121;
- 214 P<0.001) of the DCP layer were associated with DR progression. The FAZ and SCP
- 215 metrics were not independently associated with future DR progression (all P>0.05).
- Figure 2 shows a representative patient with OCTA alterations at baseline and \geq two-
- 217 step progression during follow-up.
- 218

219 Additional Value of OCTA Metrics in the Prediction Model

- 220 We entered all significant OCTA metrics correlated with DR progression and the
- established risk factors detailed by Sun et al.[6] into the multivariate logistic
- regression analysis. Figure 3 illustrates the effects of adding VD, BVT, and FD to the
- original model. The addition of OCTA metrics significantly optimized the
- 224 performance of the DR progression prediction models (area under the curve [AUC],
- 225 0.805; 95% CI, 0.726-0.883 versus AUC, 0.725; 95% CI, 0.639-0.811, respectively)
- 226 (P=0.022).

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228 Discussion

- 229 The role of retinal microvascular flow and geometry in DR has attracted growing
- 230 interest in recent years; nonetheless, its value in predicting DR progression remains
- 231 controversial. This 2-year prospective SS-OCTA cohort study demonstrated that
- reduced VD and FD of the DCP and increased BVT of DCP were strongly associated

with the increased risk of DR progression, independent of confounding factors. These
parameters showed additional value to the currently used DR progression prediction
models, thereby suggesting their future implementation in a more efficient risk
stratification of DR progression. To our knowledge, this is the first study to assess the
associations between BVT and the risk of DR progression.

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239 Previous studies on relationship between OCTA-derived parameters and DR progression achieved mixed results (Table 4). Sun et al. observed the significant 240 relationship of baseline larger FAZ area, lower VD, lower FD of DCP, and DR 241 progression, while none of the SCP metrics was associated with DR progression. 242 Similarly, Custo Greig et al. demonstrated that larger FAZ area, reduced peripapillary 243 VD in the superior temporal sector and inferior temporal sector were significantly 244 245 associated with increased odds of DR progression. However, You et al. reported DR progression was significantly associated with the extrafoveal avascular area of SCP, 246 but not associated with those of DCP. In addition, studies by Tsai et al. and Marques 247 et al. showed no significant inter-group differences in baseline OCTA parameters 248 between DR progressive and stable eyes[10, 21]. This study advanced previous 249 studies by incorporating the OCTA-derived parameters for prediction of DR 250 251 progression in Chinese DM patients. The primary analysis of this study validated the predictive value of VD in DR progression, which is in accordance with previous 252 studies suggesting the association of macular ischemic changes with DR severity and 253 progression[22, 23], and decreasing VD as DR severity increases[24-26]. Moreover, it 254 255 was congruent with previous fluorescein angiography studies, which demonstrated ischemic macular changes in the development of DR[27]. 256

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OCTA-derived BVT is a parameter that quantifies microvascular complexity but its association with DR progression has not been well established. Lim et al.[28] and Cheung et al.[29] quantitatively analyzed fundoscopy images and reported that greater venular and arterial tortuosity of large vessels were associated with DR progression at 1-year and 6-year follow-up, respectively; however, this effect was

263 not observed by Klein et al. [16] after 5-year follow-up. Fundoscopy images are the possible reason for these discrepancies, as the resolution is insufficient to obtain 264 accurate measurements of detailed microvascular networks. The application of OCTA 265 in our study provided superior resolution and could detect motion changes more 266 accurately to determine the retinal microarchitecture within superficial and deep 267 capillary networks. The present study is the first to report the association between 268 269 OCTA-derived BVT and DR progression using longitudinal data. However, due to the novelty of OCTA-derived BVT parameters, reference values for potential clinical 270 applications in the future still require extensive research with large sample sizes to 271 be established. 272

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FD has been proposed as a biomarker for DR severity, despite the inconsistent 274 275 conclusions about its predictive ability in longitudinal studies[20, 30, 31]. Sun et al.[6] demonstrated that FD of the DCP was correlated with DR progression, whereas no 276 significant association was noted on the full-depth retinal projection in the Time-2b 277 study[7]. These discrepancies likely arise from different segmentation methods of 278 retinal layers and the relatively small sample size. Our study observed each SD 279 decrease in FD was associated with a 1.484 times greater risk of DR progression after 280 281 adjusting for confounding factors. As a lower FD value represents decreased global complexity of the vascular tree, our findings suggest DR patients with greater 282 deviations from normal retinal microvascular networks are at a higher risk of DR 283 progression. Chronic hyperglycemia inflicts microvascular network remodeling in 284 vivo, which could lead to changes in shear forces and helical flow, ultimately 285 resulting in fragile blood vessels. Therefore, FD alterations are present before the 286 clinical indications of DR progression, implying a potential biomarker for monitoring 287 DR deterioration. In addition, FD has a debatable reliability for un-replicated 288 289 segmentation methods based on fundoscopy images[32]. SS-OCTA adopted in this 290 study enabled FD detection with higher imaging resolution and unified image quality inspection compared with previous studies. Future studies should follow classical 291 methods to ensure consistent and comparable findings. 292

Conventional risk factors cannot adequately predict DR progression, thus 294 necessitating other biomarkers to better control DR and its societal impact[2, 3, 33]. 295 We verified the value of adding VD, FD, and BVT parameters to another risk model 296 for predicting DR progression, elevating the original AUC from 0.725 to 0.805 297 (P=0.022). Such predictive power implicated retinal vessel geometry and flow in the 298 299 pathology of DR and implied that the model may be of interest to clinical trials and guidelines. Interestingly, all OCTA parameters associated with DR progression were 300 present in the DCP layer, and none of the SCP layer parameters had similar 301 prognostic values. Microvascular changes associated with DR progression may occur 302 earlier in the DCP layer than those in the SCP layer, consistent with histological 303 studies revealing that DCP is more sensitive to hyperglycaemia[34, 35] and cross-304 305 sectional OCTA studies that reported on higher diagnostic power of DCP-derived OCTA metrics for differentiating patients with DM from healthy controls[26, 36-38]. 306 307 These findings highlight the potential role of OCTA parameters in grading DR risk and will aid in clinical decision-making for DR patients likely to experience a worsening 308 prognosis. Ideally, we intend to examine and validate the proposed model in a real-309 world setting in future to assess its clinical value for DR progression risk assessments. 310

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The strengths of this study were its prospective cohort design and relatively 312 large sample size. The adjustment for all known confounding factors through a 313 multivariate model and the corrected image magnification owing to AL variation are 314 also features of this study that have been neglected by previous authors[39]. 315 Previous literature has demonstrated that the magnification error caused by axial 316 length variation affects the measurement of FAZ derived from OCTA, particularly in 317 higher aberrations of axial length. Since axial length strongly correlates with the 318 319 refractive error, high myopic patients with spherical degree of \leq -6 D and axial length 320 of >26 mm were excluded at baseline. The study had several limitations. First, the 2year follow-up was relatively short, which restricted the number of times DR 321 progression could be captured. Second, all patients were Chinese with T2DM, which 322

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323 may limit the generalizability of our results to other ethnicities. Third, SS-OCTA metrics were centered only on the macula and had a small field of view, which 324 limited conclusions about the predictive power of the peripheral retina. Fourth, 325 because this study used a commercial SS-OCTA, errors from the default settings may 326 result in measurement bias. To minimize this possibility, we performed manual 327 corrections when necessary. Fifth, 53 eyes of 286 eligible eyes (18.53%) were 328 329 excluded from the analysis, increasing the possibility of selection bias. Sixth, only DM patients were included which prevents the directly comparisons between normal 330 subjects and DM patients. You et al. [40] had reported that the mean values of 331 parafoveal VD on SCP and DCP were 49.21% (34.27% to 66.01%) and 59.35% (29.83% 332 to 69.23%) in the population-based samples, respectively. The mean values of VD in 333 SCP and DCP were higher than those in normal population but within the range. 334 335 Future studies are needed to compare the trajectory of OCTA metrics among normal subjects, patients with high risk for DR progression, and patients with low risk for DR 336 337 progression. Finally, DME occurred in 10 eyes (4.46%), which is lower than the 8.76% reported by Sun et al.[6], which may be due to the discrepancy in patient 338 recruitment strategy. In the Sun et al. study, patients were recruited from patients 339 attending ophthalmology specialties, while the present study was recruited from the 340 341 community, where the patients had lower disease severity. The lens density might influence the OCTA metrics, and the LOCS-3 grading are on-going. 342

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In conclusion, reduced VD and FD and increased BVT of DCP were significantly associated with a higher risk of DR progression in 2 years. The addition of these parameters into conventional prediction models significantly increased the AUC, which implied that retinal blood flow and geometries are important pathological changes preceding DR. Future studies should determine the validity of integrating these OCTA metrics into prediction models in a real-world setting and their impact on improving clinical decision-making for DR management.

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515 Figure legends

516 **Figure 1.** Flow and geometric metrics based on OCT angiography (OCTA) images in

517 the superficial capillary plexus (SCP) and deep capillary plexus (DCP). FAZ=foveal

- avascular zone area; VD=vessel density; FD=fractal dimension; BVT=blood vessel
- 519 tortuosity
- 520
- 521 **Figure 2.** Representative case showing > 2 step worsening of retinopathy alongside
- significant OCTA changes. Significant rarefaction of VD and discontinuous FAZ area
- 523 were observed in both SCP and DCP. OCTA=optical coherence tomography
- angiography; DR=diabetic retinopathy; FAZ=foveal avascular zone area;
- 525 SCP=superficial capillary plexus; DCP=deep capillary plexus.
- 526
- 527 **Figure 3.** Receiver operating characteristic (ROC) curves based on traditional risk
- 528 factors and the addition of significant OCTA metrics in predicting DR progression.
- 529 OCTA=optical coherence tomography angiography; DR=diabetic retinopathy;
- 530 AUC=area under the curve.