

Diagnostic Accuracy of Diabetic Retinopathy Grading by an Artificial Intelligence-enabled Algorithm compared with a human standard for Wide-field True-colour Confocal Scanner and Standard Digital Retinal Images

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3 **1 Diagnostic Accuracy of Diabetic Retinopathy Grading by an Artificial Intelligence-enabled**
4 **2 Algorithm compared with a human standard for Wide-field True-colour Confocal Scanner and**
5 **3 Standard Digital Retinal Images**

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22 **Synopsis:**

23 The EyeArt software is able to classify true-colour, wide-field confocal images with comparable
24 accuracy and sensitivity to that of manual grading of standard digital photographs for diabetic
25 retinopathy.

Confidential: For Review Only

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6 28 **Abstract**
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10 29 BACKGROUND: Photographic diabetic retinopathy screening requires labour-intensive grading of
11 30 retinal images by humans. Automated retinal image analysis software (ARIAS) could provide an
12 31 alternative to human grading. We compare the performance of an ARIAS using true-colour, wide-
13 32 field confocal scanning images and standard fundus images in the English National Diabetic Eye
14 33 Screening Programme (NDESP) against human grading.
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17 34 METHODS: Cross-sectional study with consecutive recruitment of patients attending annual diabetic
18 35 eye screening. Imaging with mydriasis was performed (2-field protocol) with the EIDON platform
19 36 (CenterVue, Padua, Italy) and standard NDESP cameras. Human grading was carried out according to
20 37 NDESP Protocol. Images were processed by EyeArt v2.1.0 (Eyenuk Inc, Woodland Hills, CA). The
21 38 reference standard for analysis was the human grade of standard NDESP images.
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24 39 RESULTS: We included 1257 patients. Sensitivity estimates for retinopathy grades were: EIDON
25 40 images 92.27%(95%CI:88.43-94.69%) for any retinopathy, 99%(95% CI:95.35-100%) for vision-
26 41 threatening retinopathy and 100%(95%CI:61-100%) for proliferative retinopathy. For NDESP images:
27 42 92.26%(95%CI:88.37-94.69%) for any retinopathy, 100%(95%CI:99.53-100%) for vision-threatening
28 43 retinopathy and 100%(95%CI:61-100%) for proliferative retinopathy. One case of vision-threatening
29 44 retinopathy(R1M1) was missed by the EyeArt when analysing the EIDON images, but identified by
30 45 the human graders. The EyeArt identified all cases of vision-threatening retinopathy in the standard
31 46 images.
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34 47 CONCLUSION: EyeArt identified diabetic retinopathy in EIDON images with similar sensitivity to
35 48 standard images in a large-scale screening programme, exceeding the sensitivity threshold
36 49 recommended for a screening test. Further work to optimise the identification of “no retinopathy”
37 50 and to understand the differential lesion detection in the two imaging systems would enhance the
38 51 use of these two innovative technologies in a diabetic retinopathy screening setting.
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55 **INTRODUCTION**

56 Diabetic retinopathy is one of the most common microvascular complications of diabetes.[1] There
57 are 451 million people with diabetes worldwide, and this is projected to rise to 639 million in
58 2045.[2] An early diagnosis through regular clinical examination or grading of retinal photographs is
59 essential to identify sight-threatening retinopathy and prevent diabetes-related visual
60 impairment.[3,4] Annual screening of the retina is recommended for all patients with diabetes, but
61 due to its prevalence, this represents a significant organisational and financial challenge that
62 requires trained human graders.[5]

63 The automated grading of retinal images has improved due to advances in computational power,
64 availability of big data sets, and due to the publicly available machine learning and neural network
65 libraries. Artificial intelligence-enabled automated retinal image analysis software (ARIAS) now allow
66 accurate and speedy detection of retinopathy without the need for human graders.[6–14] The
67 diagnostic accuracy of ARIAS have been reported to be comparable to that of expert graders on 45
68 degree 2-field conventional digital photographs.[14,15]

69 In the English National Diabetic Eye Screening Programme (NDESP), screening is offered with two 45-
70 degree fundus digital photographs per eye (macula- and disc-centred images) to every person with
71 diabetes aged 12 years and older.[16] Progress in retinal imaging has led to a broader
72 implementation of wide-field fundus imaging. Methods such as scanning laser ophthalmoscopy or
73 digital confocal scanning pose possible advantages over standard imaging used in population
74 screening programmes which may include, better or similar acquisition times, reduced rates of
75 ungradable images in eyes with poor mydriasis[17] and more detailed visualisation of high-risk
76 retinopathy features.[18] There is a well-recognised trade-off between wider field of view and the
77 practicalities and costs involved in population screening. Nevertheless, some eyes present clinically
78 significant diabetic retinopathy features outside the two 45-degree fields or the seven standard
79 ETDRS fields.[18,19] Using ultra-wide field imaging, a subgroup of patients with predominantly
80 peripheral lesions have shown increased risk of progression.[20] However, ultra-wide field imaging
81 may miss posterior-pole and peripheral neovascular disease when compared with the ETDRS
82 fields.[19] The EIDON platform (EIDON™; CenterVue, Padua, Italy) is a wide-field confocal scanner
83 that obtains 60-degree (horizontal) true-colour fundus photographs per exposition by means of a
84 white light-emitted diode illumination (440–650 nm).[21] Advantages of the EIDON over ultra-wide
85 field imaging platforms are the true-colour nature of the images and absent distortion of posterior

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3 86 pole, which may make this platform more sensitive to high-risk retinopathy features, including
4 proliferative disease.[18,19] However, no comparative study exists. The independent validity of the
5 performance results of ARIAS on 60 degree true-colour images of this nature and their clinical
6 applicability to high-volume screening programmes has not been evaluated.
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10 This study aims to compare the screening performance of a commercially available ARIAS (EyeArt)
11 on images obtained with two platforms with different optical properties and field of view, the true-
12 colour wide-field confocal scanner (EIDON) and English NDESP-approved fundus cameras against
13 NDESP human grading in a large-scale, community-based diabetic retinopathy screening
14 programme.
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98 MATERIALS AND METHODS

99 This cross-sectional, comparative study involved 1,257 adult patients (≥ 18 years) who had been
100 included in a previous cross-sectional, comparative service evaluation study of an imaging
101 platform.[18] The study protocols of both studies were registered and approved through the
102 research governance process at the Homerton University Hospital and adhered to the English NDESP
103 guidelines,[22,23] the tenets of the Declaration of Helsinki, and the UK Data Protection Act 2018.

104 The study protocol has been described elsewhere.[18] In brief, during the three-month study period
105 2,629 patients underwent routine photographic screening. All patients were asked if they were
106 willing to have an additional set of images taken with a second camera. A total of 1,257 patients had
107 this additional imaging. Written informed consent was obtained from all patients who accepted to
108 take part in the study.

109 Image acquisition and human grading

110 Image acquisition and grading has been described in detail in a previous publication.[18] The English
111 NDESP protocol was used in this study.[23,24] All patients underwent a 2-field imaging protocol with
112 mydriasis to capture two images per eye (one macula- and one disc-centred image) with the EIDON
113 confocal scanner and with English NDESP approved fundus cameras. A list of the approved fundus
114 cameras can be found in the NDESP guidance on camera approval.[25] In routine screening practice
115 and therefore in this study, additional images are often taken and stored on the screening software
116 to ensure that enough images of sufficient quality for retinal grading are obtained and to document
117 anterior segment pathology. No anterior segment images were captured with the EIDON platform.

118 The NDESP approved cameras image a field of 45-degrees horizontal and vertical with a resolution of
119 at least 12 megapixels for each capture.[25] A combination of the macula and disc-centred images
120 cover a field of 60 degrees horizontal x 45 degrees vertical (NDESP images). The wide-field true-
121 colour confocal scanner captures a field of 60-degrees horizontal x 50-degrees vertical with a
122 resolution of 14 megapixels per exposition.[21] A combination of the macula and disc-centred
123 images covers a field of 75 degrees horizontal x 50 degrees vertical (EIDON images).

124 The National Screening Committee UK classification for DR was utilised for grading. The grading
125 classification in order of increasing severity are no retinopathy (R0), background retinopathy (R1), no
126 maculopathy (M0), ungradable (U), maculopathy (M1), pre-proliferative retinopathy (R2) and
127 proliferative retinopathy (R3).[26] The NDESP images were managed and graded as protocol of the

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3 128 current English NDESP pathway, where up to three levels of human graders in increasing order of
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5 129 experience who meet the NDESP quality assurance standards assessed the images to determine a
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7 130 disease severity grade and produce a “final grade” for each eye according to the highest level of
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9 131 severity observed. Disagreements between level 1 and 2 human graders for episodes that are
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11 132 potentially M1 or R2 are arbitrated by the level 3 human grader, whose assessment is final. A final
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13 133 outcome human grade for the NDESP images was obtained after this. Referral to hospital eye service
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15 134 is carried out for patients with grades M1, R2 and R3. Patients with an U grade are re-examined by
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17 135 slit lamp biomicroscopy within the screening programme according to NDESP guidelines and
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19 136 referred to the hospital for the above diabetic retinopathy grades or for other pathology.

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21 137 The EIDON images were not introduced to the NDESP grading pathway because of their different
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23 138 colour cast and higher pixel density when compared with the NDESP images. The EIDON images
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25 139 were graded by a level 3 human grader with both wide experience grading in the NDESP and on the
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27 140 manipulation techniques needed to grade EIDON images. The grader was masked to the outcome of
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29 141 grading the standard images. The resultant EIDON images human grades were compared with the
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31 142 final NDESP images human grades. All the patient encounters where there was a discrepancy
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33 143 between the EIDON and NDESP images human grade were re-examined by a different experienced
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35 144 level 3 grader within the screening programme and an ophthalmologist to obtain a consensus EIDON
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37 145 images human grade.

38 146 Automated grading system

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40 147 A commercially available ARIAS (EyeArt Software, v2.1.0, Eyenuk Inc, Woodland Hills, CA), was used
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42 148 for this analysis. This automated system for diabetic retinopathy detection, with Conformité
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44 149 Européen mark, offers a cloud-based platform for data analysis allowing scalable, elastic computing
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46 150 for data processing. This version of the software combines core diabetic retinopathy analysis
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48 151 algorithms of the version 1.2 with features derived from deep-learning multiple convolutional neural
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50 152 networks.[27] The software is designed to identify cases of diabetic retinopathy that are R1 or above
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52 153 and provides an output of “disease” or “no disease”. An additional output of “refer” vs. “no refer” is
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54 154 designed to identify cases which require referral (U grade or above) to eye hospital services. The
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56 155 total of the images was uploaded into the cloud-based technology of the EyeArt as two separate
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58 156 batches, one for the EIDON images and another one for the standard NDESP images. All processing
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60 157 of the screening episodes was performed by the research team. The vendor was not allowed access
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62 158 to the software or to the dataset during the study period. The batch process for both sets was
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64 159 carried out overnight without any technical issues.

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6 161 In a service evaluation study of the EIDON confocal scanner with human grading, it was evidenced
7 162 that the EIDON images were able to visualise high-risk retinopathy features which were missed by
8 163 the NDESP images.[18] Because of this, the selection of the reference standard can be debatable.
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10 164 However, since this is a diabetic retinopathy screening study, the performance of the ARIAS was
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12 165 assessed using the final NDESP image human grades as ground truth.
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15 166 Statistical analysis
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17 167 Statistical calculations were performed using R studio, version 1.1.463 (www.r-project.org). Accuracy
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19 168 of sensitivity, false positive rate (specificity) and likelihood ratios were defined by 95% confidence
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21 169 intervals (CIs) obtained using bootstrapping for the EIDON and NDESP image grades. In cases with
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23 170 sensitivity estimates of 100%, the exact Clopper-Pearson method was used to obtain CI estimates.
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25 171 Calculations were determined for any retinopathy (grades R1, U, M1, R2 or R3), vision-threatening
26 172 retinopathy (grades M1, R2 or R3) and for each grade of retinopathy separately.
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174 **RESULTS**

175 A total of 2,508 eyes of 1,257 patients were included in the study. A total of 11,796 images were
176 obtained (5,061 and 6,735 images with the EIDON and standard fundus cameras, respectively). The
177 prevalence of retinopathy according to the final human NDESP grades for R0, R1, M1, R2 and R3 was
178 65.39%, 32.06%, 6.92%, 1.03%, and 0.48%, respectively. Prevalence of retinopathy according to final
179 human EIDON grades for R0, R1, M1, R2 and R3 was 57.68%, 39.14%, 7.08%, 1.67%, and 0.56%,
180 respectively. Table 1 shows the ARIAS sensitivity (detection rate) and false-positive rates for the
181 EIDON and NDESP images using the worst eye final human grade of the NDESP images as the
182 reference standard. The specificity for episodes graded as no retinopathy (R0M0) with the EIDON
183 images was 53%, and 74% with the NDESP images. The point estimates for sensitivity using the final
184 grade of the NDESP images as reference standard were: EIDON images 92.27% (95% CI 88.43-
185 94.69%) for any retinopathy, 99% (95% CI 95.35-100%) for vision-threatening retinopathy and 100%
186 (95% CI 61-100%) for proliferative retinopathy. Corresponding sensitivities for NDESP images were
187 92.26% (95% CI 88.37-94.69%) for any retinopathy, 100% (95% CI 99.53-100%) for vision-threatening
188 retinopathy and 100% (95% CI 61-100%) for proliferative retinopathy. The diagnostic accuracy for
189 the point estimates of Table 1 and likelihood ratios are shown in Table 2.

190 The ARIAS correctly classified all vision-threatening retinopathy cases when using the NDESP image
191 grades. When using the EIDON images, the ARIAS correctly classified 98.8% of the vision-threatening
192 cases (1 case missed). The case missed by the ARIAS using the EIDON images was a case with a
193 human grade of R1M1 in both sets of images requiring routine referral. The proportion of cases of
194 vision-threatening diabetic retinopathy missed by the ARIAS was therefore 1.02% (1 case) with the
195 EIDON images. For the most severe retinopathy grade (R3, proliferative retinopathy), all cases were
196 correctly classified by the ARIAS in both imaging modalities (sensitivity of 100%).

197 The comparison of the human grading of EIDON and NDESP images of this sample,[18] evidenced
198 detection of 8 additional cases of R2 and 1 additional case of R3 with the EIDON images due to
199 visualisation of features outside the field of view of the NDESP images (2 cases), and by cause of
200 diabetic retinopathy feature visualisation within the 45-degree fields (8 cases) which were not
201 identified when grading the NDESP images. A figure illustrating these differences is found in a
202 previous publication comparing the human grading of EIDON and NDESP images.[18]

203 If the reference standard for comparison against the ARIAS outcome were the human grading of the
204 EIDON images, sensitivity for the detection of any retinopathy is 91.38% (95% CI 87.84-93.69), and

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3 205 99.08% (95% CI 95.65-100) for vision-threatening retinopathy when processing the EIDON images.
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5 206 When analysing the NDESP images, sensitivity for any retinopathy is 83.30% (95% CI 78.57-86.35),
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7 207 and for vision-threatening retinopathy 100% (95% CI 99.53-100). The accuracy, sensitivity, false
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9 208 positive rate and likelihood ratios defined by 95% confidence intervals when using the final EIDON
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11 209 human grade as reference standard are available online as supplementary material (Supplementary
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13 210 tables 1 to 4).

14 211 The ARIAS provides an alternative classification that attempts to identify cases which require referral
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16 212 (grades U, M1, R2 and R3) as an alternative output ("refer" vs "no refer"). The findings of this
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18 213 alternative output for the EIDON and NDESP images in terms of sensitivity (detection rate), false-
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20 214 positive rates, and diagnostic accuracy of the point estimates are presented as supplementary
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22 215 material (Supplementary tables 5 and 6). A marked effect for patients with R0M0 and R1M0 human
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24 216 grades was found when comparing the ARIAS "disease" vs "no disease", and "refer" vs "no refer"
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26 217 output in the EIDON images results (See tables 1 and 3, respectively). The ARIAS classified 53% of the
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28 218 R0M0 episodes as "no disease", compared with 78% classified as "no refer". From the R1M0 cases,
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30 219 9% were classified as "no disease", compared with 50% classified as "no refer". The NDESP images
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32 220 automated grading showed a marked effect in patients graded R1M0 when comparing between
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34 221 these two different ARIAS output. The ARIAS classified 9% of the R1M0 cases as "no disease",
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36 222 compared with 63% classified as "no refer". The impact on the other retinopathy grades using this
37
38 223 comparison was less marked. Sensitivity for R1M1 reduced from 99% to 90% using the EIDON
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40 224 images. A sensitivity reduction for R1M1 from 100% to 92% was found using the NDESP images. No
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42 225 change was present for R3 grades in either image modality. The likelihood ratios for R1M1, R2 and
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44 226 R3 detection were greater with the NDESP images and were even greater for both imaging
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46 227 modalities in the output to identify referral (Tables 2 and 4).

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235 Table 1. Screening performance of the EyeArt software with EIDON and NDESP (National Diabetic Eye Screening Programme) images compared with final
 236 human grade of NDESP images using the classification of disease vs. no disease.

Human Grade (Worst Eye)	No. of Screening Episodes (Number, % ^a)		EyeArt Outcome (Row % ^b)							
			EIDON images				NDESP images			
			No disease		Disease		No disease		Disease	
Retinopathy grade	n	%	n	%	n	%	n	%	n	%
R0M0	822	65.39	438	53.28	384*	46.72	611	74.33	211*	25.67
R1M0	324	25.78	28	8.64	296	91.36	29	8.95	295	91.05
U	13	1.03	5	38.46	8	61.54	4	30.77	9	69.23
R1M1	79	6.28	1	1.27	78	98.73	0	0.00	79	100.00
R2	13	1.03	0	0.00	13	100.00	0	0.00	13	100.00
R2M0	9	0.72	0	0.00	9	100.00	0	0.00	9	100.00
R2M1	4	0.32	0	0.00	4	100.00	0	0.00	4	100.00
R3	6	0.48	0	0.00	6	100.00	0	0.00	6	100.00
R3M0	2	0.16	0	0.00	2	100.00	0	0.00	2	100.00
R3M1	4	0.32	0	0.00	4	100.00	0	0.00	4	100.00
Combination of grades										
R0M0, R1M0	1146	91.17	466	40.66	680	59.34	640	55.85	506	44.15
R1M1, R2, R3	98	7.80	1	1.02	97	98.98	0	0.00	98	100.00
U, R1M1, R2, R3	111	8.83	6	5.41	105	94.59	4	3.60	107	96.40

R1M0, U, R1M1, R2, R3	435	34.61	34	7.82	401	92.18	33	7.59	402	92.41
Total	1257	100.00	472	37.55	785	62.45	644	51.23	613	48.77

* Estimates refer to the proportion classified as disease present (i.e. false positives).

^a Percentage of the total screened.

^b Percentage within each human grade.

Grading classification in order of increasing severity are no retinopathy (R0), background retinopathy (R1), no maculopathy (M0), ungradable (U), maculopathy (M1), pre-proliferative retinopathy (R2) and proliferative retinopathy (R3).

238 Table 2. Screening performance of the EyeArt software with EIDON and NDESP (National Diabetic Eye Screening Programme) images compared
239 with final human grade of NDESP images: 95% confidence limits and likelihood ratios using the classification disease vs. no disease

Human Grade (Worst Eye)	EIDON		NDESP	
	Proportion classified as disease present		Proportion classified as disease present	
	Estimate (95% Confidence Interval)	Likelihood ratio vs. R0 (95% Confidence Interval)	Estimate (95% Confidence Interval)	Likelihood ratio vs. R0 (95% Confidence Interval)
Retinopathy grade				
R0M0*	0.47 (0.42-0.50)	-	0.26 (0.22-0.29)	-
R1M0	0.91 (0.87-0.94)	1.74 (1.62-1.87)	0.91 (0.86-0.94)	2.67 (2.42-2.93)
U	0.63 (0.18-0.88)	0.87 (0.51-1.50)	0.70 (0.25-0.93)	1.50 (1.04-2.16)
R1M1	0.99 (0.94-1.00)	1.65 (1.57-1.74)	1 (0.96-1)	2.18 (2.04-2.34)
R2	1 (0.79-1.00)	1.61 (1.54-1.68)	1 (0.79-1)	1.92 (1.65-2.25)
R2M0	1 (0.72-1)	1.61 (1.54-1.68)	1 (0.72-1)	1.86 (1.50-2.30)
R2M1	1 (0.47-1)	1.60 (1.54-1.67)	1 (0.47-1)	2.06 (1.94-2.18)
R3	1 (0.61-1)	1.61 (1.54-1.68)	1 (0.61-1)	2.06 (1.95-2.18)
R3M0	1 (0.22-1)	1.60 (1.54-1.67)	1 (0.22-1)	2.05 (1.94-2.17)
R3M1	1 (0.47-1)	1.60 (1.54-1.67)	1 (0.47-1)	2.06 (1.94-2.18)
Combination of grades				

ROM0, R1M0	0.59 (0.55-0.62)	-	0.44 (0.40-0.47)	-
R1M1, R2, R3	0.99 (0.95-1)	1.67 (1.59-1.76)	1 (0.95-1)	2.21 (2.06-2.37)
U, R1M1, R2, R3	0.95 (0.88-0.98)	1.60 (1.50-1.71)	0.97 (0.91-0.99)	2.17 (2.01-2.34)
R1M0, U, R1M1, R2, R3	0.92 (0.88-0.95)	1.98 (1.83-2.14)	0.92 (0.88-0.95)	3.60 (3.19-4.06)

*Estimates refer to the proportion classified as disease present (i.e. false positives).

Grading classification in order of increasing severity are no retinopathy (R0), background retinopathy (R1), no maculopathy (M0), ungradable (U), maculopathy (M1), pre-proliferative retinopathy (R2) and proliferative retinopathy (R3).

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DISCUSSION

The photographic screening of diabetic retinopathy is a complex multilevel task requiring comprehensive image assessment by human graders. Our study demonstrates that the overall screening performance and diagnostic accuracy of the EyeArt software using the EIDON images is acceptable in terms of sensitivity for detection of any retinopathy and vision-threatening diabetic retinopathy. The diagnostic accuracy of the EyeArt and EIDON images falls within the sensitivity levels first set by the British Diabetic Association for a diabetic retinopathy screening test,[16] achieving good sensitivity when compared with human graders. The use of diverse retinal images with different quality and, in this case, from platforms with different optical properties in a large-scale community screening programme, contributes to the literature and can be used to assess future deployment of EyeArt with standard fundus photographs and/or true-colour wide-field confocal scanning images in diabetic retinopathy screening programmes. Differences in performance of ARIAS related to new imaging technology, new diagnostic algorithms, or new screening populations (e.g. new ethnicity mix, higher prevalence of cataract) may affect the diagnostic accuracy or the cost-effectiveness of this technology. When considering large scale, population-based screening programmes, independent validation and rigorous standardisation will be needed to ensure the potential of ARIAS to save vision is not squandered.

The sensitivity above 92% for any retinopathy and 100% for vision-threatening retinopathy found in our analysis adds to the previous reports using standard fundus photographs.[14,15,27–29] A recent study in 100,000 consecutive patients, using the EyePACS imaging protocol, from 404 primary care clinics comparing the performance of the EyeArt v2.0 against grading from trained certified ophthalmologists and optometrists, reported a sensitivity for any retinopathy and vision-threatening disease of 91% and 98.5%, respectively.[27] Additionally, a report using images obtained from a portable smartphone-based imaging device in 296 patients, found a sensitivity for any retinopathy and vision-threatening diabetic retinopathy of 95.8% and 99.1%, respectively.[30]

The EyeArt picked up 99% of all the cases of vision-threatening retinopathy when analysing the EIDON images, missing just 1 case of R1M1 requiring routine referral and not missing any of the more severe R2 or R3 cases. Moreover, when analysing the NDESP images, the EyeArt correctly classified all cases of vision-threatening disease, which was in agreement with previous work.[14,31] Deployment of ARIAS within the NDESP before, or as a substitution, of the level 1 graders revealed cost-effectiveness of the approach for the screening of diabetic retinopathy in both cases.[13,14,32] Because of the referral pathway structure of the English NDESP, even if an ARIAS is overly sensitive, the patient is likely to achieve the appropriate outcome at the end of the screening episode. Our

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3 279 study evidenced a lower false-positive rate for ROM0 with both imaging modalities (47% and 26%
4 with the EIDON and NDESP images, respectively), hence higher specificity, when compared with a
5 280 previous version of the EyeArt software reported in the study of Tufail et al.[14] With this
6 281 performance, if the software were to be hypothetically deployed as a part of the English NDESP, the
7 282 EyeArt could reduce the need to grade ROM0 by half when using EIDON images and by almost two
8 283 thirds when using the NDESP images, a considerable workload reduction. It should be emphasized
9 284 that in the English NDESP, graders are mostly non-medical personnel and cost-effectiveness in
10 285 different health care settings would depend on the graders used, the salary band equivalents, and
11 286 their sensitivity and specificity for detection of vision-threatening retinopathy.
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13 288 Previous studies have suggested that similar screening programmes using trained human graders
14 289 have a diagnostic accuracy comparable to that of ARIAS. Sensitivity for referable retinopathy for
15 290 human graders evaluating 1-field photographs with a reference standard defined as consensus grade
16 291 from expert graders, has been reported to be 91.9% on average (range 81.9% to 95.0%).[33] The
17 292 reference standard for comparison in our study was the human consensus grade of the NDESP
18 293 images and the design did not look at the accuracy of human graders. However, the diagnostic
19 294 accuracy obtained in our analysis is acceptable for a diagnostic test. Attention must be drawn to the
20 295 different imaging platforms. Following the two-field imaging protocol, the EIDON platform provides
21 296 images by means of confocal scanning with a total field of view after combination of the macula- and
22 297 disc-centred image of 75-degree horizontal x 50-degree vertical.[21] On the other hand the
23 298 combination of the macula- and disc-centred NDESP images provide a 60-degree horizontal x 45-
24 299 degree vertical field of view. The difference in the field of view and image quality due to the
25 300 different optics of each platform could play a role when deployed for analysis with the currently
26 301 available ARIAS. Furthermore, the EyeArt has not been optimised for EIDON images and algorithm
27 302 reference patterns might not be properly recognised by the current version of the software.
28 303 Although the performance is already acceptable, future iterations of EyeArt software may yield even
29 304 better performance if optimised for EIDON images.

30 305 This study has certain limitations. Demography, duration of diabetes, ethnicity, time taken for
31 306 imaging with each imaging platform, and pupillary diameter of this dataset were not analysed. It has
32 307 been reported that the majority of the population who undergoes diabetic retinopathy screening are
33 308 older than 60 years.[34] Since the recruitment of the sample was carried out in a large-scale,
34 309 community-based screening programme, we have assumed that the demographic data of this
35 310 sample is likely to be representative of the population who undergoes screening on a yearly basis.
36 311 Ethnicity may influence the performance of an ARIAS due to different levels of fundus pigmentation

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3 312 and fundus colour.[35] However, a study analysing a sample of 20,212 patients with White
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5 313 European, Asian and Black African-Caribbean ethnicities found no strong evidence to suggest that
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7 314 the sensitivity of a previous version of the ARIAS used in our study varies by ethnicity or sex.[14]
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9 315 There might be a “black-box” issue with the EyeArt and the process of EIDON images because the
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11 316 reference parameters or data points used by the software might not be the same as the ones used in
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13 317 standard 45-degree colour fundus images, hence potential differences in grading. Further work is
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15 318 needed to define if the wide-field true-colour images provide advantages in terms of diagnostic
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17 319 accuracy with the EyeArt software. A health economic model may be warranted to evaluate the
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19 320 deployment of these technologies in large-scale screening programmes.
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22 322 **CONCLUSION**

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24 323 The use of the EyeArt software for analysis of true-colour wide-field confocal scanning images
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26 324 (EIDON) is shown to be accurate and sensitive enough for diabetic retinopathy screening in a large-
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28 325 scale, community screening programme setting in comparison with standard retinal photographs per
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30 326 English NDESP protocol. Proper implementation and use of the EyeArt, in conjunction with either
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32 327 standard fundus photographs or true-colour wide-field confocal scanning images, and information
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34 328 technology infrastructure, could address the evolving challenge of diabetic retinopathy screening
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36 329 and improve the delivery of eye care.
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21 340 **COMPETING INTEREST**

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24 341 There are no competing interest to declare for any author.
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37 347 **DATA AVAILABILITY STATEMENT**

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39 348 The data that support the findings of this study are available from the North East London Diabetic
40 349 Eye Screening Programme upon reasonable request.
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352 **CONTRIBUTORSHIP STATEMENT**

353 As per ICMJE guidelines, all the authors agree to be accountable for all aspects of the work done on
354 this study. In addition, each individual author's contributions are:

355 A Olvera-Barrios. – Statistical analysis, interpretation of data, manuscript preparation and
356 manuscript approval.

357 T Heeren. – Statistical analysis, interpretation of data, manuscript preparation and manuscript
358 approval.

359 Konstantinos Balaskas. – Acquisition of data, manuscript preparation and manuscript approval.

360 Ryan Chambers. – Acquisition of data, manuscript preparation and manuscript approval.

361 Louis Bolter. – Acquisition of data, manuscript preparation and manuscript approval.

362 Adnan Tufail. – Study conception and design, interpretation of data, manuscript preparation and
363 manuscript approval.

364 Catherine Egan. – Study conception and design, interpretation of data, manuscript preparation and
365 manuscript approval.

366 John Anderson. – Study conception and design, interpretation of data, manuscript preparation and
367 manuscript approval.

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Supplementary Table 1. Screening performance of EyeArt with EIDON and National Diabetes Eye Screening Programme (NDESP) images compared with the human grade of the EIDON images as ground truth using the classification of “disease” vs. “no disease”

Manual Grade (Worse Eye)	No. of Screening Episodes (Number, %)		EyeArt Outcome (Row %)				NDESP images			
			EIDON images		Disease		No disease		Disease	
			No disease	Disease	No disease	Disease	No disease	Disease		
Retinopathy grade	n	%	n	%	n	%	n	%	n	%
R0M0	725	57.68	426	58.76	299	41.24	555	76.55	170	23.45
R1M0	414	32.94	43	10.39	371	89.61	85	20.53	329	79.47
U	12	0.95	2	16.67	10	83.33	4	33.33	8	66.67
R1M1	78	6.21	1	1.28	77	98.72	0	0.00	78	100.00
R2	21	1.67	0	0.00	21	100.00	0	0.00	21	100.00
R2M0	15	1.19	0	0.00	15	100.00	0	0.00	15	100.00
R2M1	6	0.48	0	0.00	6	100.00	0	0.00	6	100.00
R3	7	0.56	0	0.00	7	100.00	0	0.00	7	100.00
R3M0	2	0.16	0	0.00	2	100.00	0	0.00	2	100.00
R3M1	5	0.40	0	0.00	5	100.00	0	0.00	5	100.00
Combination of grades										
R0M0, R1M0	1139	90.61	469	41.18	670	58.82	640	56.19	499	43.81
R1M1, R2, R3	106	8.43	1	0.94	105	99.06	0	0.00	106	100.00
U, R1M1, R2, R3	118	9.39	3	2.54	115	97.46	4	3.39	114	96.61
R1M0, U, R1M1, R2, R3	532	42.32	46	8.65	486	91.35	89	16.73	443	83.27
Total	1257	100.00	472	37.55	785	62.45	644	51.23	613	48.77

Supplementary Table 2. Screening performance of EyeArt software using EIDON and National Diabetes Eye Screening Programme (NDESP) images compared with the human grade of the EIDON images as ground truth: 95% confidence limits and likelihood ratios using the EyeArt classification “disease” vs. “no disease”

Manual Grade (Worst Eye)	EIDON		NDESP	
	Proportion classified as disease present		Proportion classified as disease present	
	Estimate (95% Confidence Interval)	Likelihood ratio vs. R0 (95% Confidence Interval)	Estimate (95% Confidence Interval)	Likelihood ratio vs. R0 (95% Confidence Interval)
Retinopathy grade				
R0M0*	0.41 (0.36-0.45)	-	0.23 (0.19-0.26)	-
R1M0	0.99 (0.94-1)	1.82 (1.69-1.97)	0.79 (0.74-0.83)	2.36 (2.12-2.62)
U	0.84 (0.42-1)	1.34 (1.04-1.73)	0.67 (0.22-0.92)	1.37 (0.92-2.06)
R1M1	0.99 (0.94-1)	1.64 (1.56-1.73)	1 (0.96-1)	2.2 (2.07-2.35)
R2	1 (0.87-1)	1.62 (1.55-1.69)	1 (0.87-1)	2.09 (1.97-2.21)
R2M0	1 (0.82-1)	1.61 (1.54-1.68)	1 (0.82-1)	2.08 (1.96-2.2)
R2M1	1 (0.61-1)	1.61 (1.54-1.68)	1 (0.61-1)	2.06 (1.95-2.18)
R3	1 (0.65-1)	1.61 (1.54-1.68)	1 (0.65-1)	2.06 (1.95-2.18)
R3M0	1 (0.22-1)	1.6 (1.54-1.67)	1 (0.22-1)	2.05 (1.94-2.17)
R3M1	1 (0.55-1)	1.61 (1.54-1.68)	1 (0.55-1)	2.06 (1.95-2.18)
Combination of grades				
R0M0, R1M0	0.59 (0.55-0.62)	-	0.44 (0.39-0.47)	-
R1M1, R2, R3	0.99 (0.95-1)	1.68 (1.59-1.77)	1 (0.97-1)	2.27 (2.13-2.42)
U, R1M1, R2, R3	0.98 (0.93-1)	1.66 (1.57-1.75)	0.97 (0.91-0.99)	2.21 (2.05-2.37)
R1M0, U, R1M1, R2, R3	0.91 (0.88-0.94)	2.22 (2.02-2.43)	0.83 (0.79-0.86)	3.55 (3.1-4.07)

*Estimates refer to the proportion classified as disease present (i.e. false positives)

Grading classification in order of increasing severity are no retinopathy (R0), background retinopathy (R1), no maculopathy (M0), ungradable (U), maculopathy (M1), pre-proliferative retinopathy (R2) and proliferative retinopathy (R3).

Supplementary Table 3. Screening performance of EyeArt with EIDON and National Diabetes Eye Screening Programme (NDESP) images compared with the human grade of the EIDON images as ground truth using the classification of “refer” vs. “no refer”

Manual Grade (Worse Eye)	No. of Screening Episodes (Number, %)		EyeArt Outcome (Row %)								
			EIDON images				NDESP images				
			No refer		refer		No refer		refer		
	n	%	n	%	n	%	n	%	n	%	
Retinopathy grade											
R0M0	725	57.68	578	79.72	147	20.28	675	93.10	50	6.90	
R1M0	414	32.94	223	53.86	191	46.14	277	66.91	137	33.09	
U	12	0.95	4	33.33	8	66.67	10	83.33	2	16.67	
R1M1	78	6.21	10	12.82	68	87.18	8	10.26	70	89.74	
R2	21	1.67	1	4.76	20	95.24	2	9.52	19	90.48	
R2M0	15	1.19	1	6.67	14	93.33	2	13.33	13	86.67	
R2M1	6	0.48	0	0.00	6	100.00	0	0.00	6	100.00	
R3	7	0.56	0	0.00	7	100.00	0	0.00	7	100.00	
R3M0	2	0.16	0	0.00	2	100.00	0	0.00	2	100.00	
R3M1	5	0.40	0	0.00	5	100.00	0	0.00	5	100.00	
Combination of grades		0.00									
R0M0, R1M0	1146	91.17	801	69.90	338	29.49	952	83.07	187	16.32	
R1M1, R2, R3	98	7.80	11	11.22	95	96.94	10	10.20	96	97.96	
U, R1M1, R2, R3	111	8.83	15	13.51	103	92.79	20	18.02	98	88.29	
R1M0, U, R1M1, R2, R3	435	34.61	238	54.71	294	67.59	297	68.28	235	54.02	
Total	1257	100.00	816	64.92	441	35.08	972	77.33	285	22.67	

Grading classification in order of increasing severity are no retinopathy (R0), background retinopathy (R1), no maculopathy (M0), ungradable (U), maculopathy (M1), pre-proliferative retinopathy (R2) and proliferative retinopathy (R3).

Supplementary Table 4. Screening performance of EyeArt software using EIDON and National Diabetes Eye Screening Programme (NDESP) images compared with the human grade of the EIDON images as ground truth: 95% confidence limits and likelihood ratios using the EyeArt classification “referable” vs. “non-referable retinopathy”

Manual Grade (Worst Eye)	EIDON		NDESP	
	Proportion classified as refer	Likelihood ratio vs. R0 (95% Confidence Interval)	Proportion classified as disease present	Likelihood ratio vs. R0 + R1M0 (95% Confidence Interval)
	Estimate (95% Confidence Interval)	Estimate (95% Confidence Interval)	Estimate (95% Confidence Interval)	Estimate (95% Confidence Interval)
Retinopathy grade				
R0M0*	0.2 (0.16-0.23)	-	0.07 (0.04-0.09)	-
R1M0	0.46 (0.39-0.51)	-	0.33 (0.26-0.38)	-
U	0.67 (0.22-0.92)	1.92 (1.28-2.89)	0.16 (0-0.42)	0.73 (0.21-2.61)
R1M1	0.87 (0.76-0.94)	2.76 (2.45-3.11)	0.9 (0.79-0.96)	4.92 (4.27-5.67)
R2	0.96 (0.77-1)	2.8 (2.47-3.16)	0.91 (0.68-1)	4.2 (3.53-5.01)
R2M0	0.94 (0.67-1)	2.71 (2.32-3.17)	0.88 (0.56-1)	3.96 (3.16-4.95)
R2M1	1 (0.61-1)	2.88 (2.67-3.1)	1 (0.55-1)	4.48 (4.04-4.97)
R3	1 (0.65-1)	2.88 (2.67-3.11)	1 (0.65-1)	4.5 (4.05-4.99)
R3M0	1 (0.22-1)	2.86 (2.65-3.08)	1 (0.22-1)	4.43 (4-4.91)
R3M1	1 (0.55-1)	2.87 (2.66-3.1)	1 (0.55-1)	4.47 (4.03-4.96)
Combination of grades				
R0M0, R1M0	0.3 (0.26-0.32)	-	0.16 (0.13-0.19)	-
R1M1, R2, R3	0.9 (0.81-0.95)	2.98 (2.67-3.33)	0.91 (0.82-0.96)	5.52 (4.78-6.37)
U, R1M1, R2, R3	0.87 (0.78-0.93)	2.94 (2.63-3.29)	0.83 (0.73-0.9)	5.06 (4.34-5.9)
R1M0, U, R1M1, R2, R3	0.55 (0.49-0.59)	2.73 (2.31-3.21)	0.44 (0.38-0.48)	6.41 (4.82-8.51)

*Estimates refer to the proportion classified as refer (i.e. false positives)

Grading classification in order of increasing severity are no retinopathy (R0), background retinopathy (R1), no maculopathy (M0), ungradable (U), maculopathy (M1), pre-proliferative retinopathy (R2) and proliferative retinopathy (R3).

Supplementary Table 5. Screening performance of the automated retinal imaging analysis software with EIDON and National Diabetes Eye Screening Programme (NDESP) images compared with final human grade of NDESP images using the classification of referable vs. non-referable retinopathy

Human Grade (Worst Eye) Retinopathy grade	No. of Screening Episodes (Number, % ^a)		EyeArt Outcome (Row % ^b)				NDESP images			
			EIDON images		refer		No refer		refer	
			n	%	n	%	n	%	n	%
R0M0	822	65.39	640	77.86	182*	22.14	758	92.21	63	7.66
R1M0	324	25.78	162	50.00	162	50.00	203	62.65	121	37.35
U	13	1.03	6	46.15	7	53.85	4	30.77	9	69.23
R1M1	79	6.28	8	10.13	71	89.87	6	7.59	73	92.41
R2	13	1.03	0	0.00	13	100.00	0	0.00	13	100.00
R2M0	9	0.72	0	0.00	9	100.00	0	0.00	9	100.00
R2M1	4	0.32	0	0.00	4	100.00	0	0.00	4	100.00
R3	6	0.48	0	0.00	6	100.00	0	0.00	6	100.00
R3M0	2	0.16	0	0.00	2	100.00	0	0.00	2	100.00
R3M1	4	0.32	0	0.00	4	100.00	0	0.00	4	100.00
Combination of grades										
R0M0, R1M0	1146	91.17	802	69.98	344	30.02	961	83.86	184	16.06
R1M1, R2, R3	98	7.80	8	8.16	90	91.84	6	6.12	92	93.88
U, R1M1, R2, R3	111	8.83	14	12.61	97	87.39	10	9.01	101	90.99
R1M0, U, R1M1, R2, R3	435	34.61	176	40.46	259	59.54	213	48.97	222	51.03
Total	1257	100.00	816	64.92	441	35.08	971	77.25	285	22.67

* Estimates refer to the proportion classified as disease present (i.e. false positives).

^a Percentage of the total screened.

^b Percentage within each human grade.

Grading classification in order of increasing severity are no retinopathy (R0), background retinopathy (R1), no maculopathy (M0), ungradable (U), maculopathy (M1), pre-proliferative retinopathy (R2) and proliferative retinopathy (R3).

Supplementary Table 6. Screening performance of the EyeArt software with EIDON and National Diabetes Eye Screening Programme (NDESP) images compared with final human grade of NDESP images: 95% confidence limits and likelihood ratios using the classification referable vs. non-referable retinopathy.

Human Grade (Worst Eye)	EIDON		NDESP	
	Proportion classified as refer		Proportion classified as refer	
	Estimate (95% Confidence Interval)	Likelihood ratio vs. R0 (95% Confidence Interval)	Estimate (95% Confidence Interval)	Likelihood ratio vs. R0 (95% Confidence Interval)
Retinopathy grade				
ROM0*	0.22 (0.18-0.25)	-	0.08 (0.05-0.09)	-
R1M0	0.50 (0.42-0.55)	-	0.37 (0.30-0.43)	-
U	0.54 (0.11-0.82)	1.30 (0.68-2.49)	0.70 (0.25-0.93)	3.27 (2.25-4.77)
R1M1	0.90 (0.79-0.96)	2.85 (2.55-3.19)	0.93 (0.83-0.98)	5.05 (4.39-5.82)
R2	1 (0.79-1)	2.91 (2.70-3.14)	1 (0.79-1)	4.24 (3.55-5.08)
R2M0	1 (0.72-1)	2.89 (2.68-3.12)	1 (0.72-1)	4.07 (3.23-5.12)
R2M1	1 (0.47-1)	2.87 (2.66-3.09)	1 (0.47-1)	4.46 (4.02-4.94)
R3	1 (0.61-1)	2.88 (2.67-3.10)	1 (0.61-1)	4.48 (4.04-4.97)
R3M0	1 (0.22-1)	2.86 (2.65-3.08)	1 (0.22-1)	4.43 (4.00-4.91)
R3M1	1 (0.47-1)	2.87 (2.66-3.09)	1 (0.47-1)	4.46 (4.02-4.94)
Combination of grades				
ROM0, R1M0	0.30 (0.26-0.33)	-	0.16 (0.13-0.18)	-
R1M1, R2, R3	0.91 (0.82-0.96)	3.04 (2.73-3.38)	0.92 (0.84-0.97)	5.51 (4.78-6.36)
U, R1M1, R2, R3	0.87 (0.77-0.93)	2.90 (2.59-3.25)	0.90 (0.81-0.96)	5.59 (4.82-6.47)
R1M0, U, R1M1, R2, R3	0.60 (0.53-0.64)	2.72 (2.34-3.16)	0.51 (0.44-0.56)	6.75 (5.22-8.72)

*Estimates refer to the proportion classified as refer (i.e. false positives).

Grading classification in order of increasing severity are no retinopathy (R0), background retinopathy (R1), no maculopathy (M0), ungradable (U), maculopathy (M1), pre-proliferative retinopathy (R2) and proliferative retinopathy (R3).