

Characterising DARC (Detecting Apoptosing Retinal Cells) spots in glaucoma and healthy eyes

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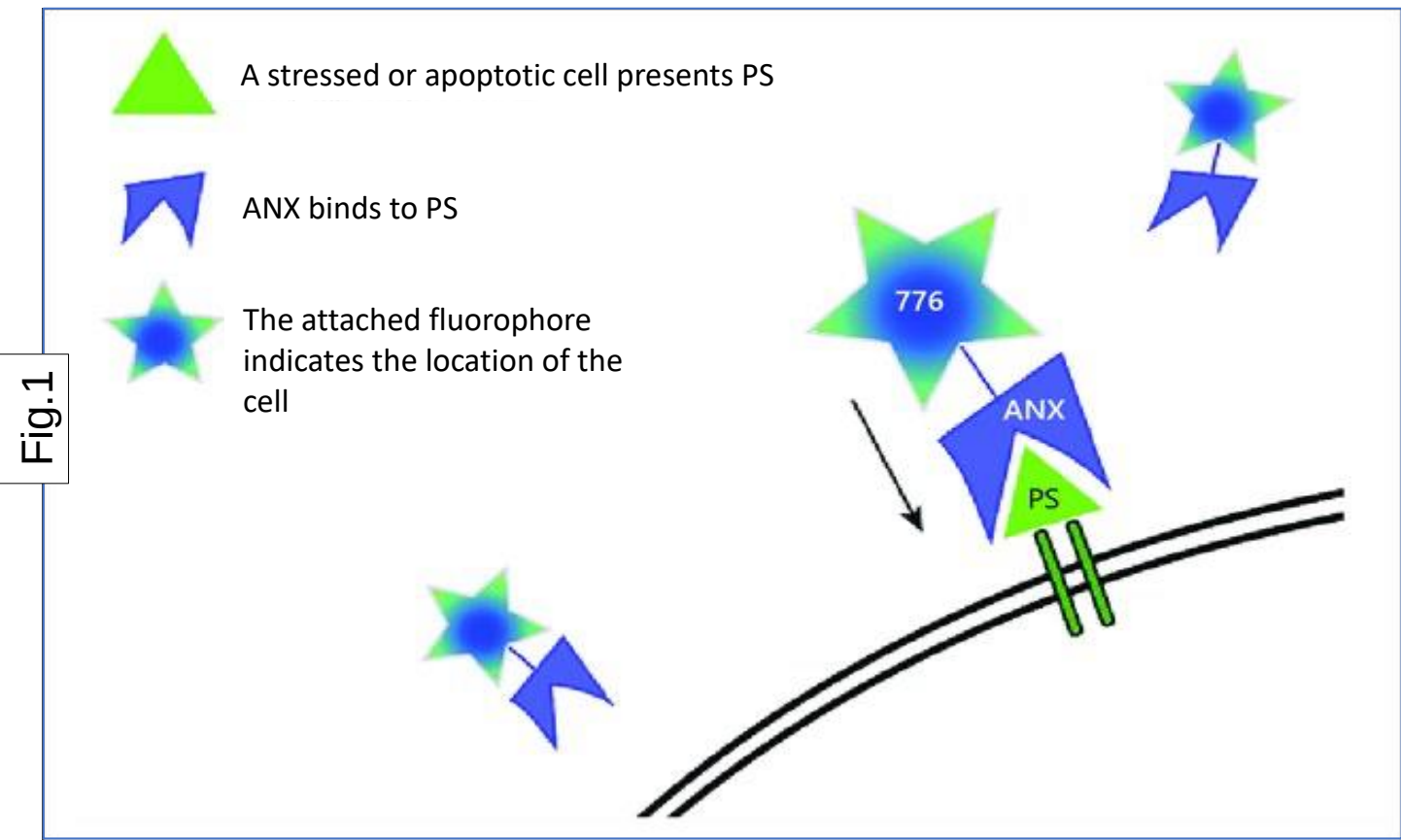
1. Introduction:

Glaucoma:

Leading cause of irreversible blindness
Unmet need for early identification
Reliable markers for disease prediction, screening and monitoring
treatment to be established

DARC Technology:

Fluorescent labelled DARC molecule binds to externalized phosphatidylserine (PS) on the membranes of cells in initial stages of cell stress or apoptosis ¹ (Fig.1)
Confocal scanning laser ophthalmoscope used to image the eye to visualise apoptosing cells as fluorescent white spots
Here we analyse the DARC spots identified using the CNN previously described ²⁻⁴ from the Phase 2 DARC clinical trial (ISRCTN10751859)



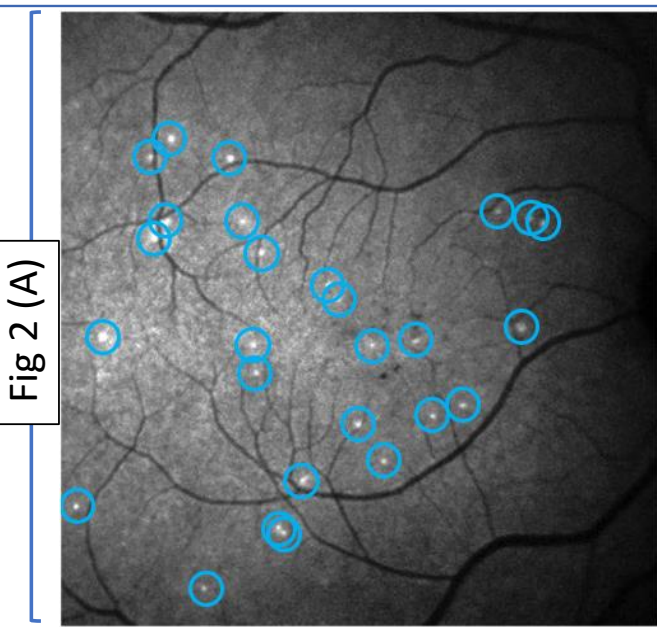
Key Question:

Are there differences in morphological parameters of DARC spots in healthy and glaucoma subjects?

2. Methods:

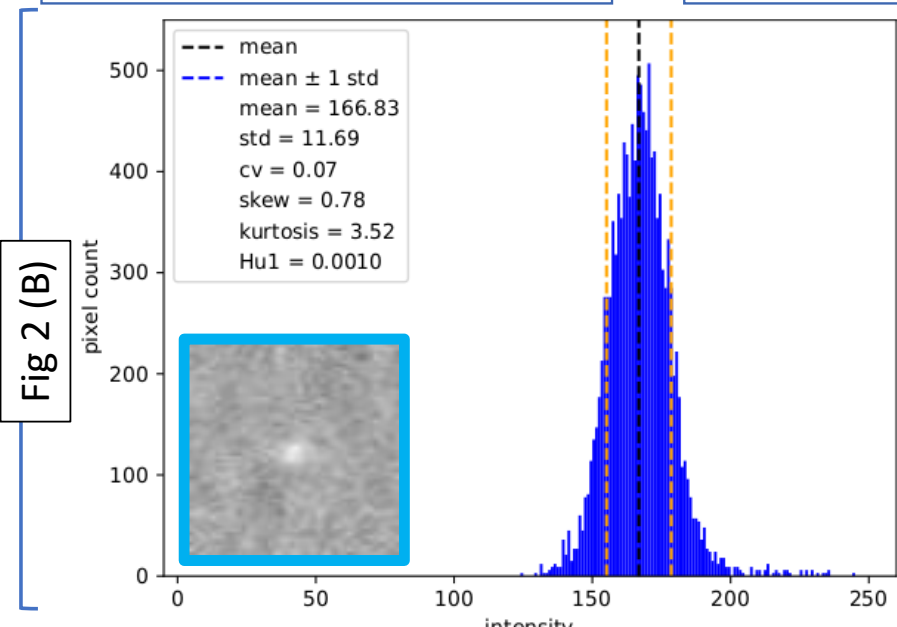
DARC images

obtained from >40 years glaucoma patient eyes (n=28) and controls (n=68)



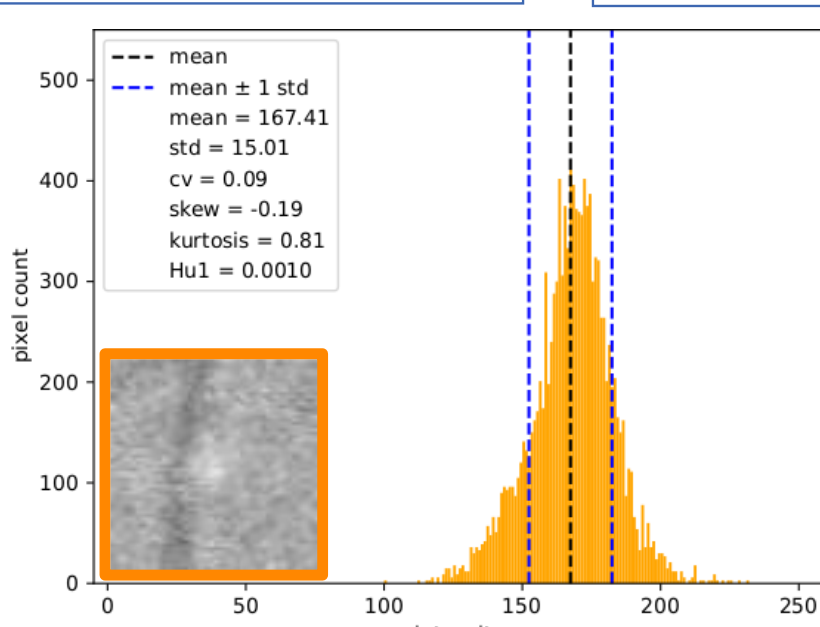
DARC spots

previously developed convolutional neural network - algorithm ²⁻⁴. Fig.2(A)



Descriptive measures (DMs)

per DARC spot defined by shape/intensity characteristics ⁵⁻⁹
13 DMs were obtained and analysed per spot. Fig.2(B,C)



Statistical analyses

Single and multiple logistic regression over 1000 bootstraps
SLR/MLR Fig.3 (A,B)

3. Results:

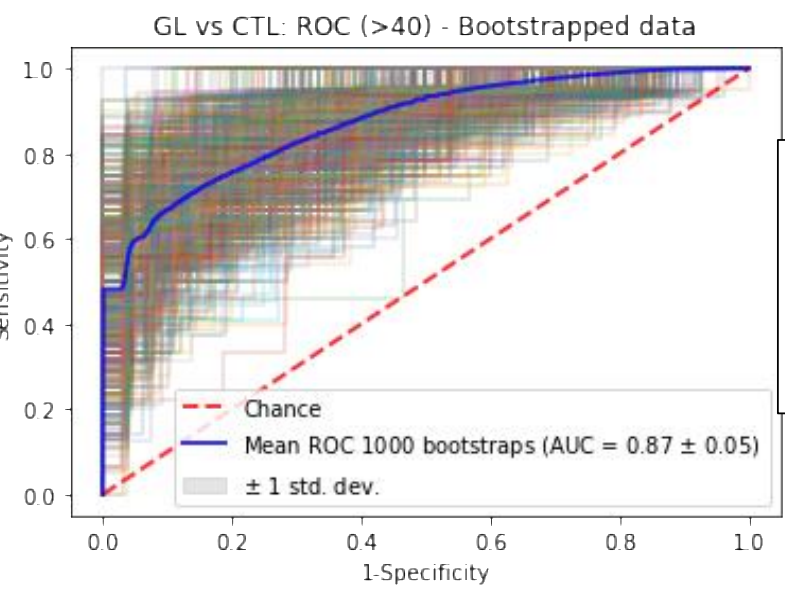


Fig 3 (A) MLR

metric	p-value	hu1	0.043
const	0.36	hu2	0.046
mean	0.609	hu3	0.882
std	0.01	hu4	0.331
cv	0.012	hu5	0.591
skew	0.996	hu6	0.416
kurtosis	0.83	hu7	0.607

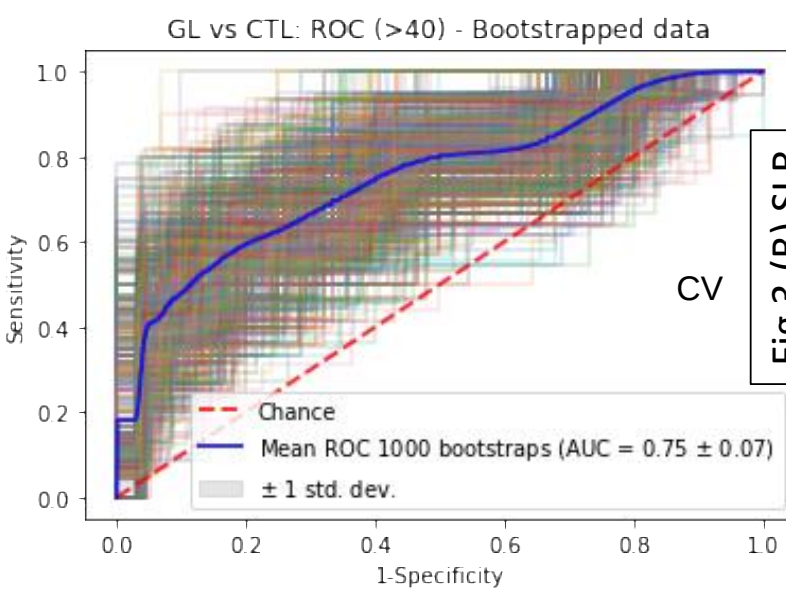


Fig 3 (B) SLR

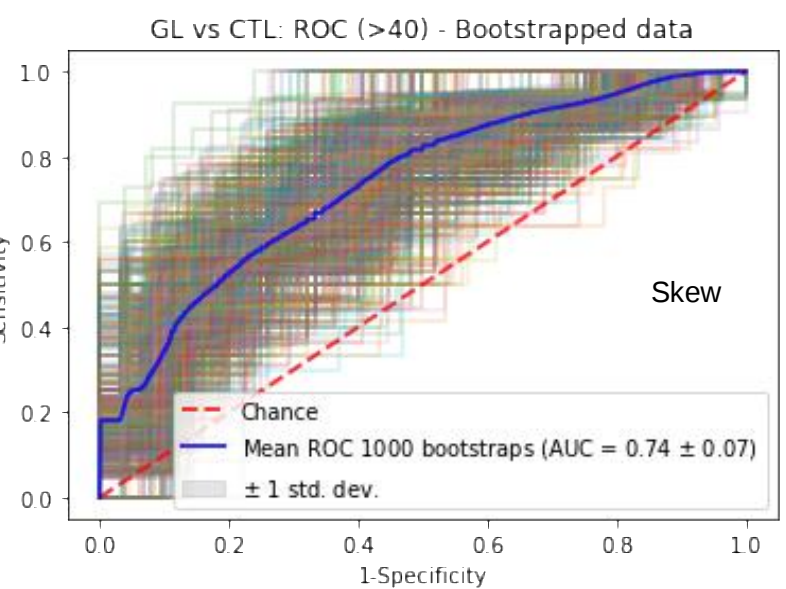


Figure.3

Multiple logistic regression (MLR) with all metrics: results in area under the curve (AUC) of 0.87. The model identifies std, cv, Hu 1 and Hu 2 moments as significant variables (A).
Single logistic regression (SLR) analyses identify cv and skew as best individual metrics with AUCs of 0.75 and 0.74 and p-values of 0.001 and 0.002 respectively (B).

Mean:
Average pixel intensity of a spot ⁸

Standard deviation (Std):
Variation about the mean⁸

Coefficient of variant (CV):
A measure of relative variability (Std/mean) ⁹

Skew:
Symmetry of histogram ⁹

Kurtosis:
Flatness of the histogram ⁸

Hu moments:
moments invariant to translation, scale, rotation and reflection ^{5,6}

Figure.2

DARC image (A) with automatically identified DARC spots (blue circles, A). DMs obtained from histograms (B) of pixel intensities per spot (insert images, B). Blue = healthy. Orange = glaucoma. Definitions of DMs (C).

4. Conclusions:

Key message and future implications:

These preliminary results suggest that there are differences in morphological parameters between glaucoma and healthy DARC spots. Further work is needed and more data on definitively differentiating glaucoma disease from health for which we plan to use artificial intelligence to investigate spatial patterns and morphological characteristics to enable further analysis in future, planned clinical trials. Until now, a CNN has only been used to identify DARC labelling.

5. References:

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