

# Retinal Vascular Features among South Indians

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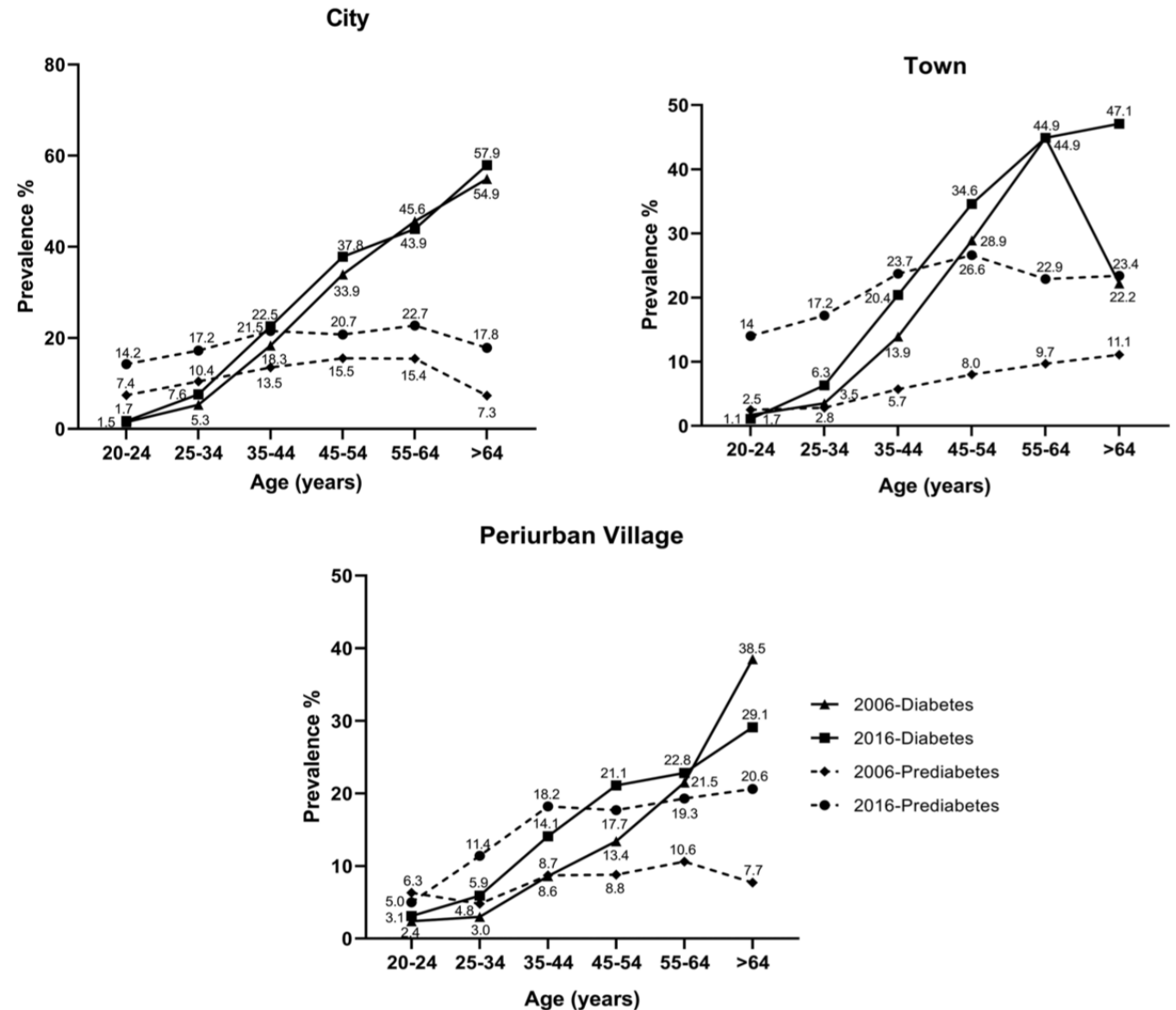
# Outline

- Background
- Why explore retinal images as biomarkers?
- What are retinal vascular features?
- Retinal Data reduction.
  - Methods
  - Results
- Experiment
  - Relationship between RVFs and Microvascular Complications: A Exploratory Analysis

# Background

- India is one of the epicentre for diabetes in Asia.
- In Tamil Nadu, prevalence is increasing, especially in villages.

Age-specific prevalence of prediabetes and diabetes in 2006 and 2016



# Background

- Diabetes disproportionately increases risk of vascular complications.

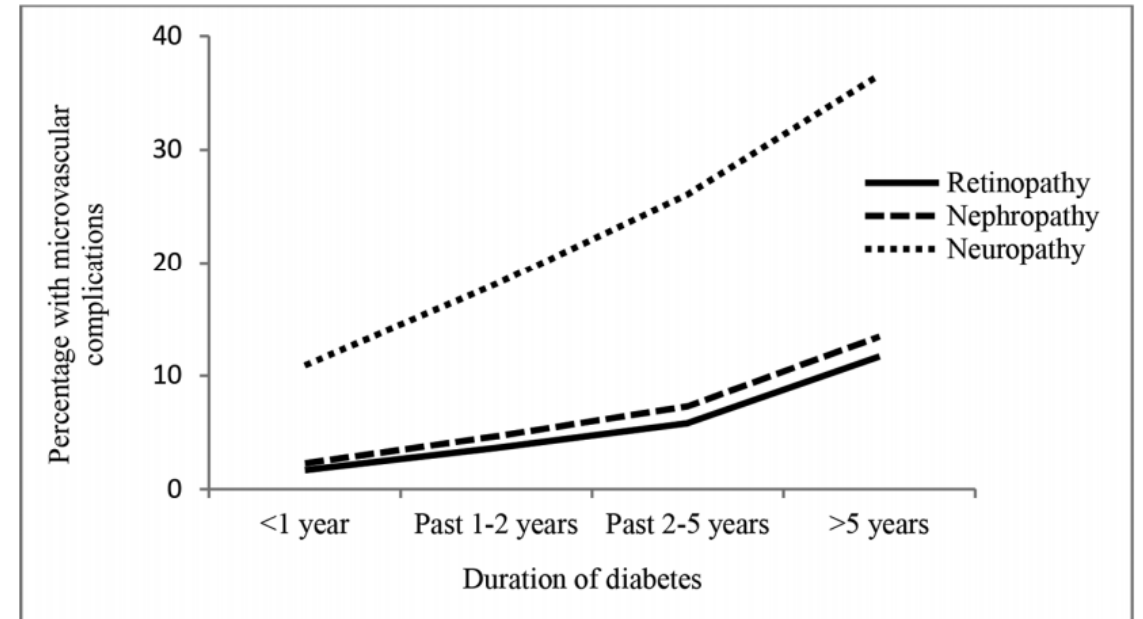
Open access

Research

BMJ Open  
Diabetes  
Research  
& Care

## Real-world evidence of glycemic control among patients with type 2 diabetes mellitus in India: the TIGHT study

Surendra S Borgharkar,<sup>1</sup> Soma S Das<sup>2</sup>



**Figure 2** Duration of diabetes and various microvascular complications.

# Why explore retina as potential biomarker?

- Non-invasive access to microvasculature (small blood vessels).
- Cost-effective and portable.
- Has to potential provide further information than DR severity.

Article | Published: 19 February 2018

**Prediction** Review Articles

from **OPEN ACCESS** **Retinal Vascular Caliber as a Biomarker for Diabetes**  
Special Issue | **Microvascular Complications**

Insight:

Ryan I. S. Cor **Retinal** M. Kamran Ikram, MD, PHD<sup>1,2,3,4</sup>, Carol Y. Cheung, PHD<sup>1,2,4</sup>, Mara Lorenzi, MD<sup>5</sup>, Ronald Klein, MD, MPH<sup>6</sup>, Teresa L.Z. Jones, MD<sup>7</sup>, Tien Yin Wong, MD, PHD<sup>1,2,4,8</sup>¶, for the NIH/JDRF Workshop on Retinal Biomarker for Diabetes Group\*

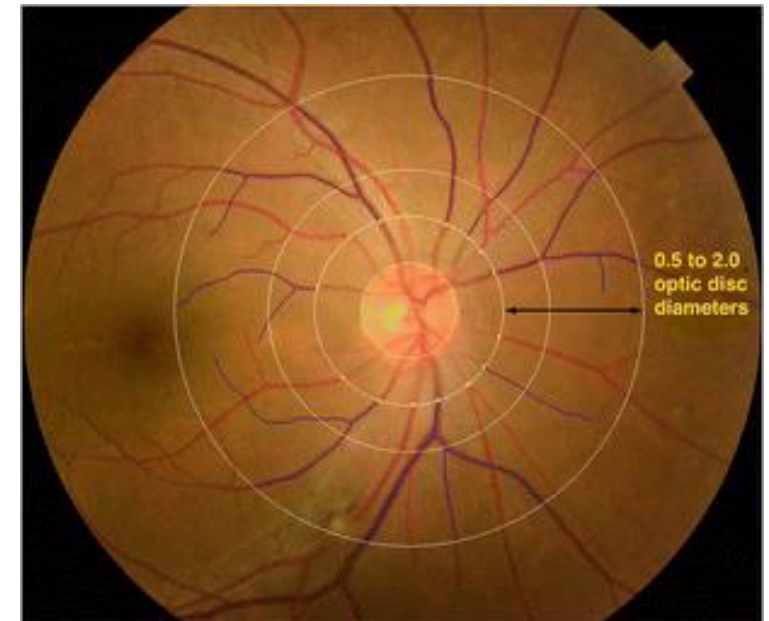
Nature **13k** A Siegfried K. Wagn Ferraz; Edward Keane  Author Affiliations

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Author Affil

Translational Visi Diabetes Care 2013 Mar; 36(3): 750-759.  
doi:<https://doi.org/10.2337/dc12-1554>

 Check for updates



# INSPIRED Project

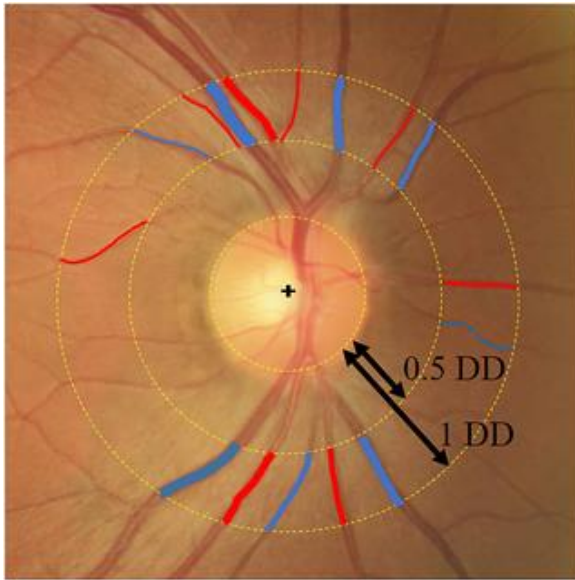
- Utilise retinal fundus images to predict type 2 diabetic vascular complications among Scottish and South Indian participants.



What are retinal vascular features (RVFs)?

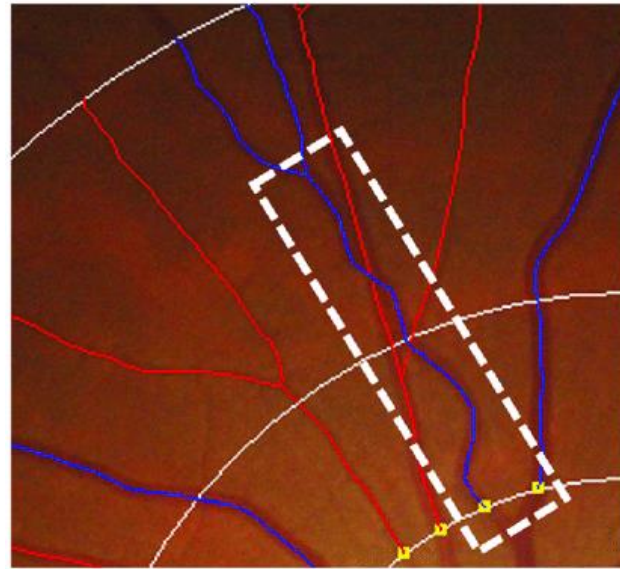


# Retinal vascular features (RVFs)?



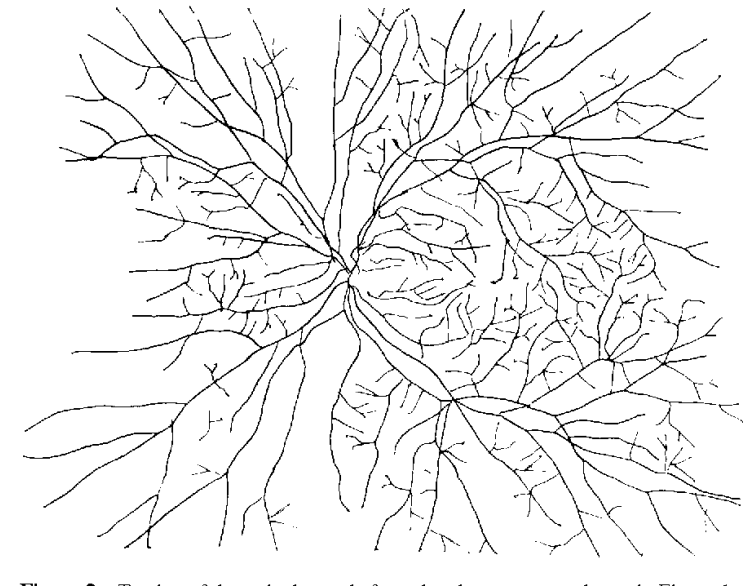
## Retinal Vessel Calibre

Six largest vessel in Zone B



## Retinal Vessel Tortuosity

Six largest vessel in Zone C



## Retinal Vessel Fractal

Measured from vessels in Zone C

- These three are common retinal features measured from fundus image.
- Measurement technique may differ , but the measurement zone are same.

### References:

1. DOI: [10.1371/journal.pone.0179663](https://doi.org/10.1371/journal.pone.0179663)
2. DOI: [10.1371/journal.pone.0203868](https://doi.org/10.1371/journal.pone.0203868)
3. DOI: [10.1146/annurev.bioeng.6.040803.140100](https://doi.org/10.1146/annurev.bioeng.6.040803.140100)

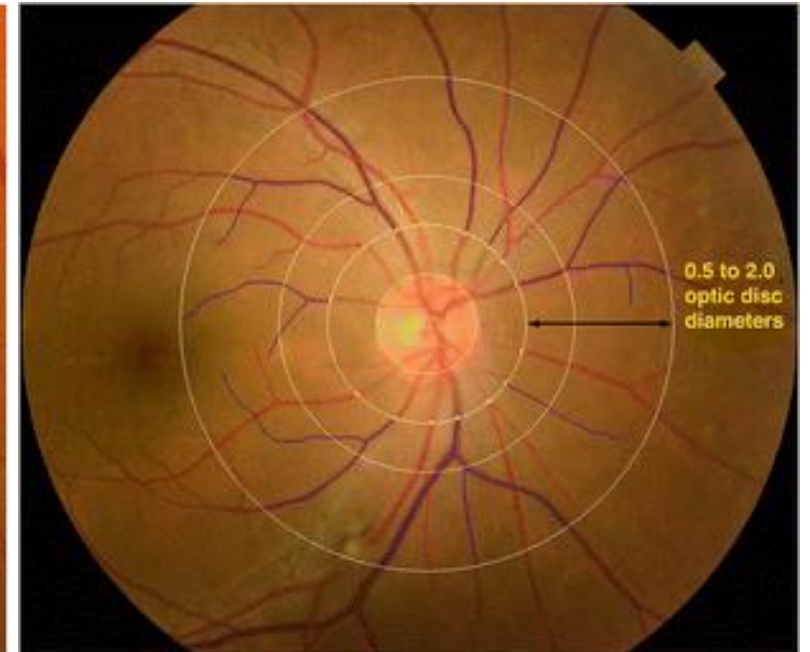
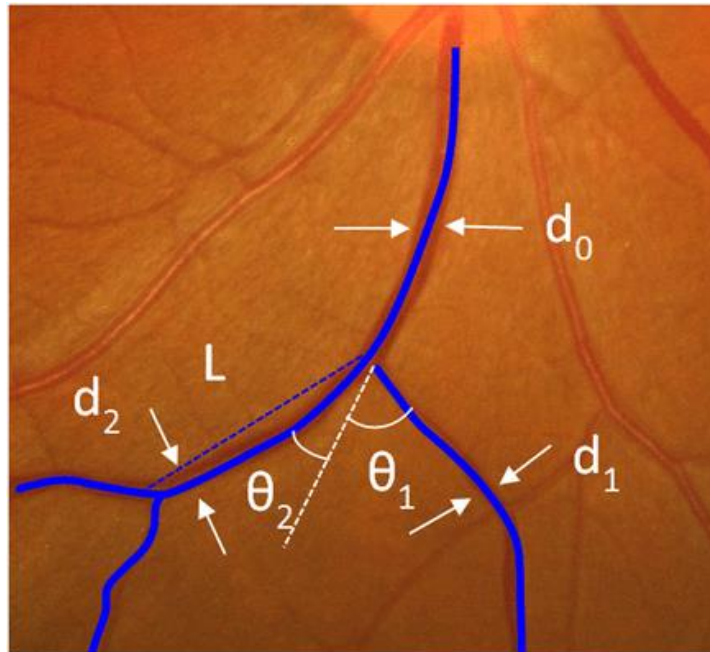


# Additional RVFs

- Branching geometry and width gradient are calculated using *Spline* and *Hermite* methods.
- 32 measurements additional RVFs are measured.

≥150 variables to manageable number of variables

Data Reduction Technique



| RVFs                  | Definition   |
|-----------------------|--|
| Branching Coefficient | Ratio of branching vessel widths to trunk vessel width $(d_1 + d_2)^2/d_0^2$           |
| Asymmetry Factor      | Ratio of the two branching vessel widths $d_2^2/d_1^2$ .                               |
| Length-Diameter Ratio | Ratio of the length between two branching points to the trunk vessel width $(L/d_0)$ . |
| Width Gradient        | Measured from main arteriolar path in each quadrant                                    |

Branching Geometry

References:

1. <https://doi.org/10.2337/dc12-1554>

Retinal images obtained from MDRF centre are optic disc centred images.

# Retinal Data reduction

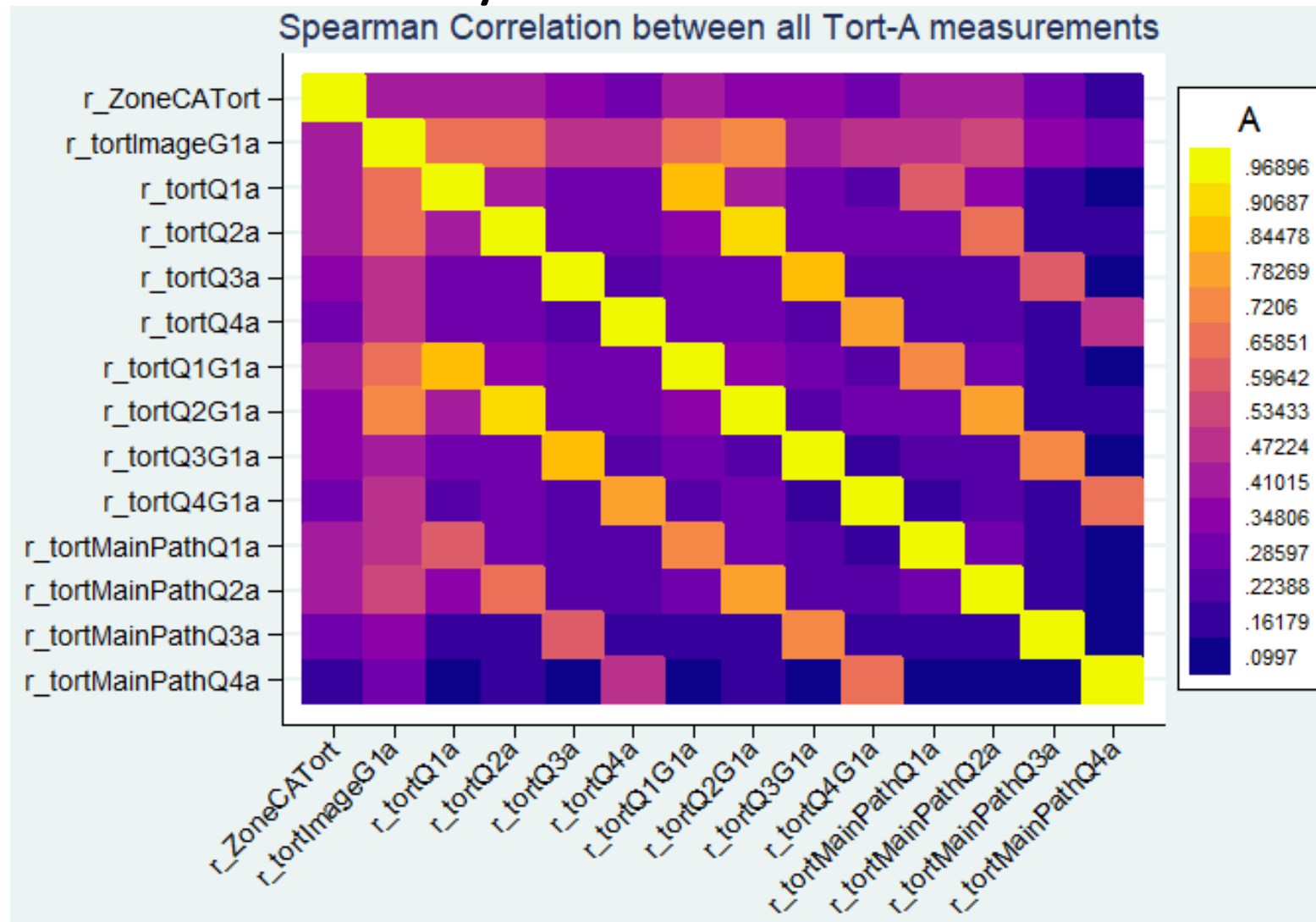
# Methods

- Retinal images were obtained from participants who visited MDRF clinic for retinal screening.
- N=2,075 diabetic participants have retinal images measured using VAMPIRE software.
- PCA technique was used to perform data reduction as it reduces several correlated variables into several linearly uncorrelated variables.
- *Tortuosity, Branching Geometry and Width Gradient* measurements underwent data reduction technique using PCA.

- Tortuosity and width gradient measurements were log-transformed.
- Branching Geometry measurements were standardize.
- Fractal dimension measurements were retained on the basis of Pearson correlation coefficient.
- Decision to retain PC's were based on Kaiser Index i.e. eigenvalue>1 and components which explained higher variance.

# Results

# Arteriolar Tortuosity



Moderate to high correlations observed between arteriolar tortuosity variables.

# Arteriolar Tortuosity

Principal components/correlation

Number of obs = 1,051

Number of comp. = 14

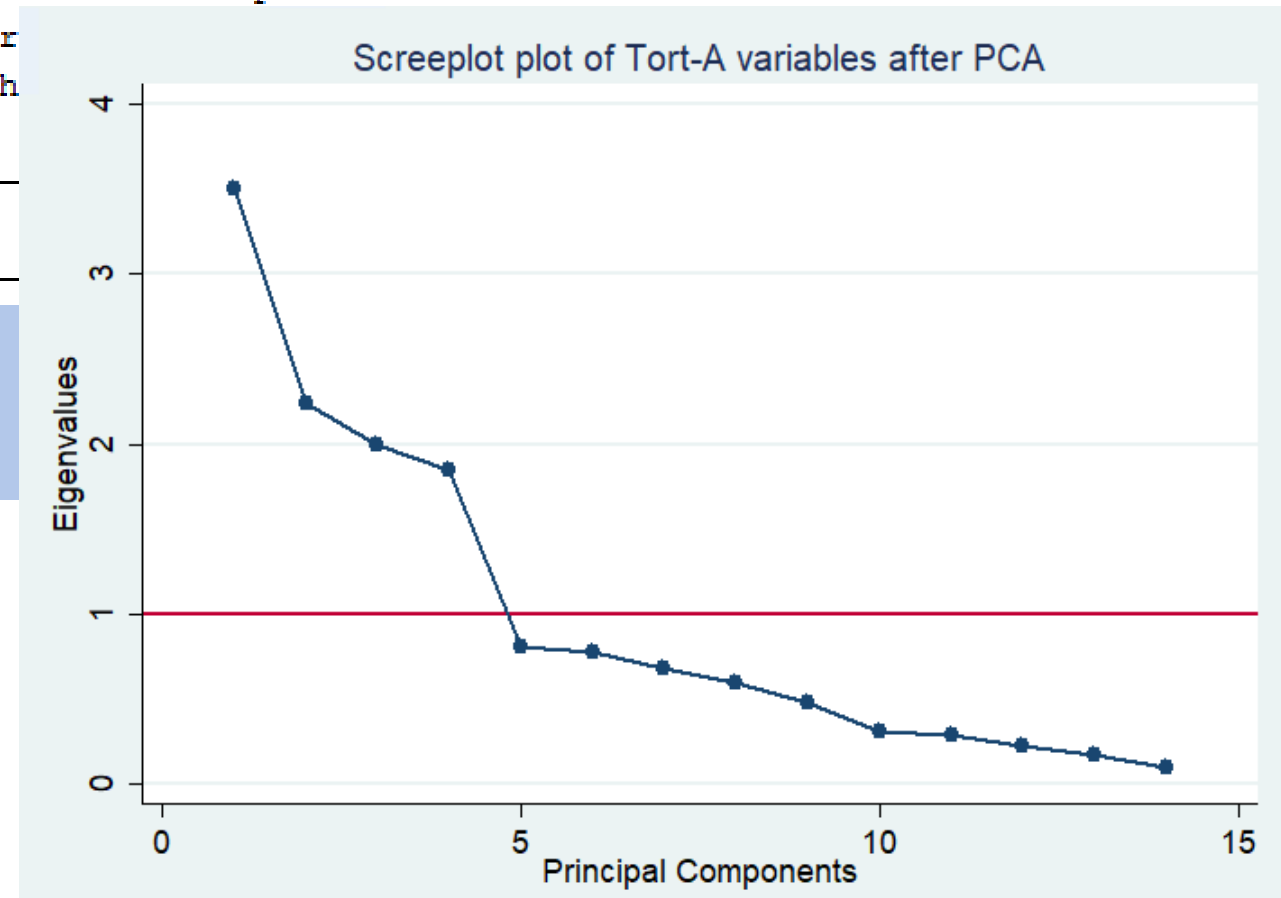
Tr

Rh

Rotation: (unrotated = principal)

| Component | Eigenvalue | Difference |
|-----------|------------|------------|
| Comp1     | 3.50337    | 1.26104    |
| Comp2     | 2.24233    | .251205    |
| Comp3     | 1.99113    | .149078    |
| Comp4     | 1.84205    | 1.03865    |
| Comp5     | .8034      | .0265315   |
| Comp6     | .776868    | .097672    |

- 4 PC's show eigenvalue > 1 and explain 68% variance, hence **retained**.





# Variables Selected using PCA

| Original Dataset  | PC's retained  |
|---|--|
| Tortuosity<br>• 28 arteriolar and venular measurements  | 4 PC's from arteriolar and venular each.   |
| Width Gradient<br>• 16 measurements   | 4 PC's retained  |
| Branching Geometry<br>• 16 measurements   | 4 PC's retained  |
| Fractal Dimension<br>• 3 arteriolar and venular measurements  | 1 arteriolar and venular measurement retained  |
| Vessel Width<br>• 2 Arteriolar and Venular Equivalent along with 2 Std. Deviation of A & V equivalent | All 4 measurements of arteriolar and venular equivalent along with std. deviation were retained. |

Out of >150 VAMPIRE measurements obtained from MDRF participants, 22 were retained using PCA.

# Experiment

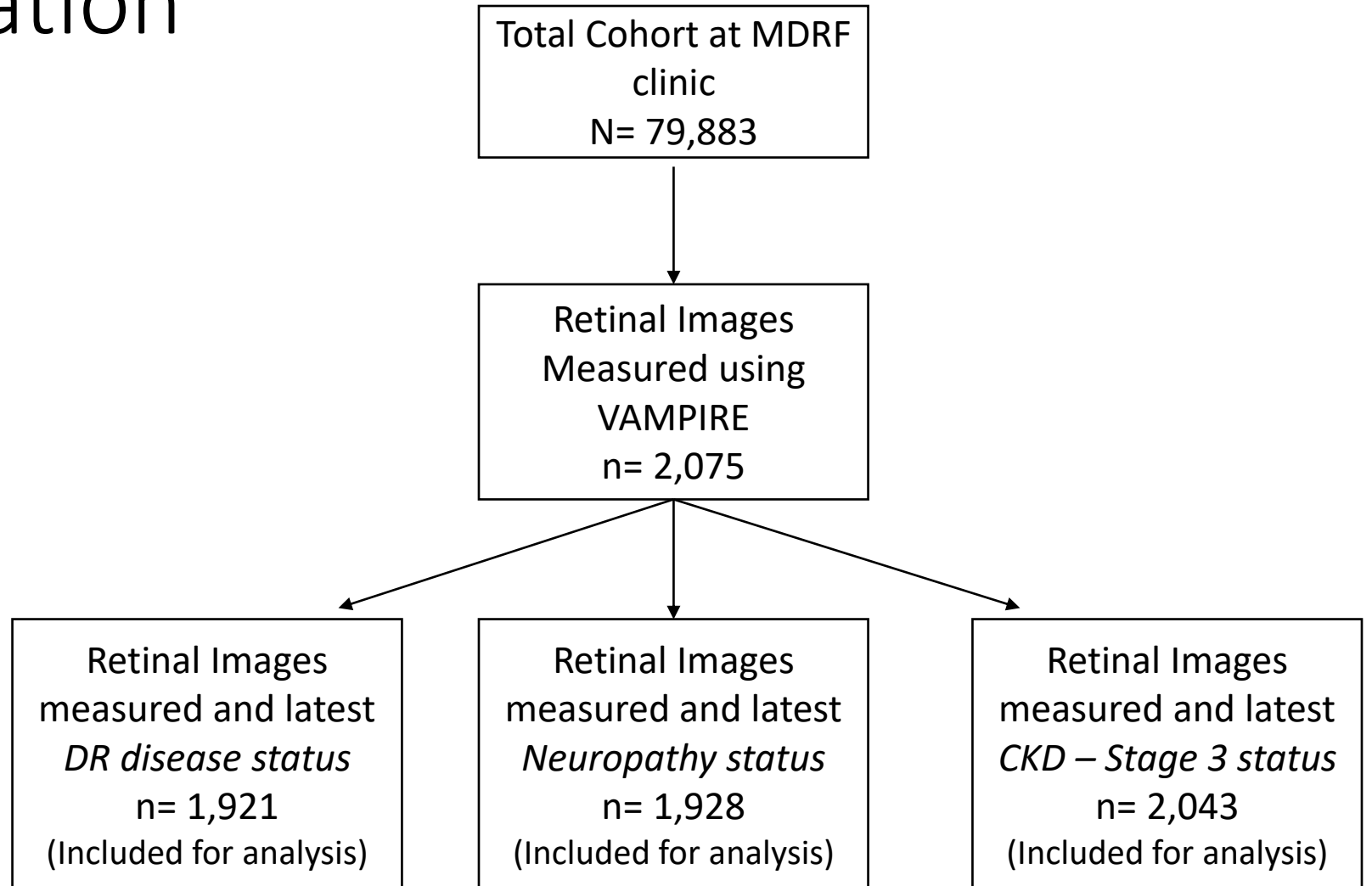
Relationship between retinal vascular features (RVFs) and microvascular complications among South Indian diabetic patients

Hypothesis: RVFs are associated with microvascular complications among diabetic patients.

# Methods

- Participants were recruited from diabetic specialist clinic in Chennai, India (MDRF).
- 2,075 participants who had retinal images measured using VAMPIRE software were included in this study.
- Participants disease status at latest visit was considered in events when participants visited to clinic more than once.

# Study Population



# Outcome Definition & Study Characteristics

|            | Microvascular Outcomes                       |                         |                                     |                                   |
|------------|--|-------------------------|-------------------------------------|-----------------------------------|
|            | Diabetic Retinopathy (DR)                    |                         | Chronic Kidney Disease (CKD)        | Neuropathy (DPN)                  |
| Definition | <i>Any DR</i>                                | <i>Proliferative DR</i> | <i>Stage 3 CKD</i>                  |                                   |
|            | Mild non-proliferative DR + Proliferative DR | Proliferative DR        | eGFR ≤ 60 mL/min/1.72m <sup>2</sup> | Great Toe Test score more than 20 |

- Study Design: Cross-sectional
- Statistical Method: Logistic regression

# Results

## Relationship between Any Diabetic Retinopathy and Retinal Vascular Features

*Number of participants with DR: 851 (44.30%)*

| RVFs                      | Base Model         |         | Full Model         |         |
|---------------------------|--------------------|---------|--------------------|---------|
|                           | OR (95% CI)        | P-value | OR (95% CI)        | P-value |
| Fractal Dimension-V \$    | 0.88 (0.81 – 0.97) | 0.01**  | 0.89 (0.81 – 0.99) | 0.031*  |
| Arteriolar Tortuosity PC1 | 1.11 (1.03 – 1.19) | 0.006** | 1.08 (1.00 – 1.17) | 0.04*   |
| Branching Geometry PC1    | 1.08 (1.01 – 1.16) | 0.02*   | 1.09 (1.00 - 1.17) | 0.031*  |

## Relationship between Proliferative Diabetic Retinopathy and Retinal Vascular Features

*Number of participants with PDR: 27 (1.41%)*

|                    |                    |       |                    |       |
|--------------------|--------------------|-------|--------------------|-------|
| Width Gradient PC1 | 0.68 (0.49 – 0.94) | 0.02* | 0.64 (0.44 – 0.93) | 0.02* |
|--------------------|--------------------|-------|--------------------|-------|

## Relationship between Chronic Kidney Disease and Retinal Vascular Features

*Number of participants with CKD – Stage 3 : 126 (6.17%)*

|                        |                    |          |                    |         |
|------------------------|--------------------|----------|--------------------|---------|
| Vessel Width-A \$      | 0.76 (0.62 - .092) | 0.007**  | 0.73 (0.58 – 0.92) | 0.008** |
| Fractal Dimension-A \$ | 0.75 (0.63 – 0.89) | 0.001*** | 0.74 (0.61 – 0.90) | 0.004** |
| Branching Geometry PC2 | 0.83 (0.71 – 0.94) | 0.006**  | 0.81 (0.69 – 0.94) | 0.009** |

Base Model : Adjusted for age and gender

Full Model : Adjusted for age, gender, HbA1c, sbp, smoke

\*p≤0.05; \*\*p≤0.01; \*\*\*p≤0.001

\$: Standardize

# Conclusion

- This study suggest relationship between RVFs and DR, and CKD – Stage 3.
- No relationship was detected between RVFs and diabetic neuropathy.
- Strength of the study, assessment conducted among large homogenous population.
- To my knowledge first study conducted among South Indian diabetic participants.
- Limitation of the study, cross-sectional nature the study.



# Further steps

- Explore relationship between any microvascular complications and retinal vascular features among MDRF participants.
- Relationship between retinal vascular features and microvascular outcomes among type 2 diabetic patients: A GoDARTS study (Paper in Progress)
- Replicate these findings in GoDARTS population; but there are *challenges*:
  1. Study Design: Prospective data points in GoDARTS after the date of image.
  2. Centering Technique of retinal images, optic disk centered images in MDRF participants.



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## a BIG Thank You

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**NIHR** | National Institute  
for Health Research

