

Utilizing the discrete orthogonality of Zernike functions in corneal measurements

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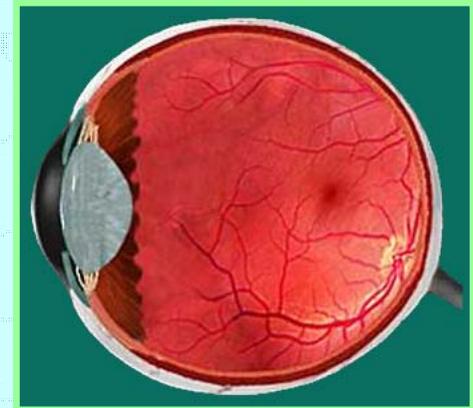
Overview of the presentation

- **Introduction**
 - reflective corneal topography and its measurement patterns
 - orthogonal system of Zernike functions
 - the use Zernike functions in ophthalmology
 - discrete orthogonal system of Zernike functions
- **Continuous Zernike functions**
 - their relation with Jacobi polynomials
- **Discretization of Zernike functions**
 - mesh ensuring the discrete orthogonality of Zernike functions
 - significance of the quadrature formulas in discretization
- **The discrete Zernike coefficients**
 - program-implementation
 - precision achieved
 - examples
- **Conclusions and future work**

Introduction – Reflective corneal topography and its measurement patterns 1/7

- Eye, cornea

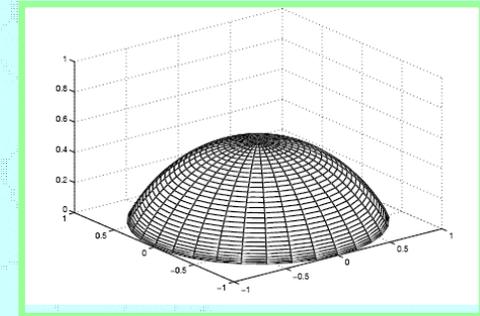
- in technical terms, the **human eye** can be considered an **imaging sensor** with its **frontal section** being responsible for focusing the incoming light rays, while
- its **rear section** is responsible for converting the image formed on its internal surface into electrical signals for further processing
- the **cornea** – located in its frontal section – is the primary optical structure of the human eye
- the corneal tissue is **transparent**
- the human cornea is an optical structure, which generates about the **70% of the total refractive power** of the eye
- **other structures** in the **light-path** – including the crystalline lens – contribute less total refractive power



Introduction – Reflective corneal topography and its measurement patterns 2/7

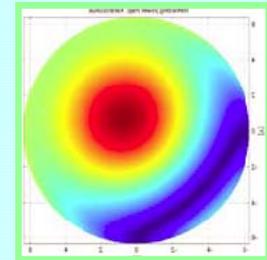
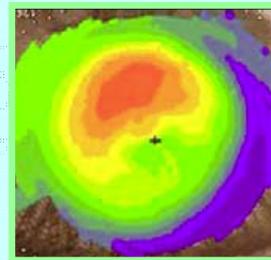
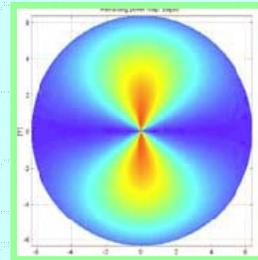
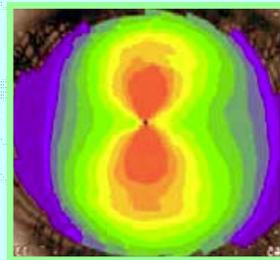
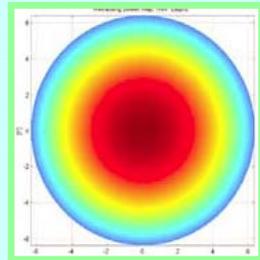
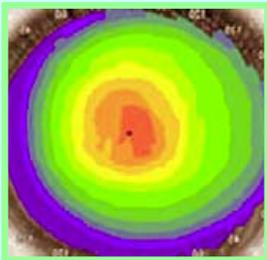
- The corneal surface

- often *modelled* as a *spherical calotte*
- there are *more complex models*, as well

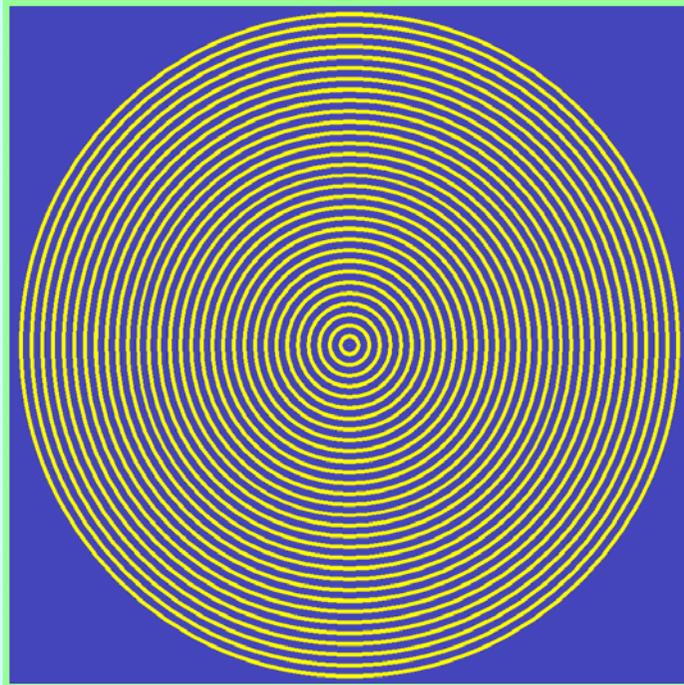


- Purpose of a cornea topographic examination

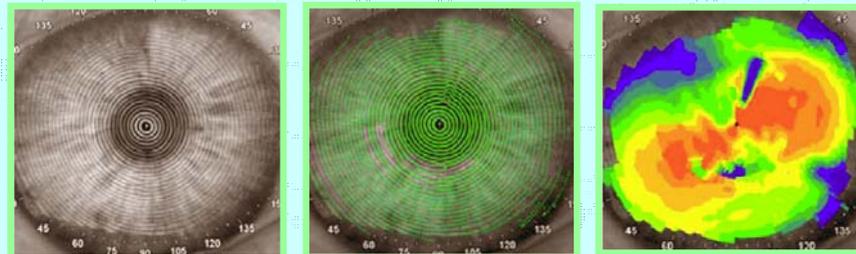
- *determine* and display the *shape* and the *refractive power* of the living cornea
- due to the *high refractive power* of the cornea, the *detailed topography* is of great diagnostic importance



Introduction – Reflective corneal topography and its measurement patterns 3/7

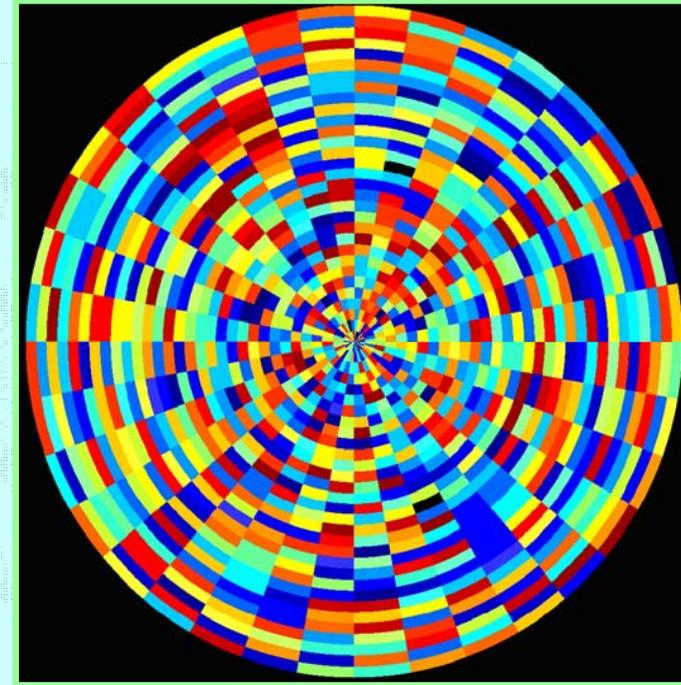
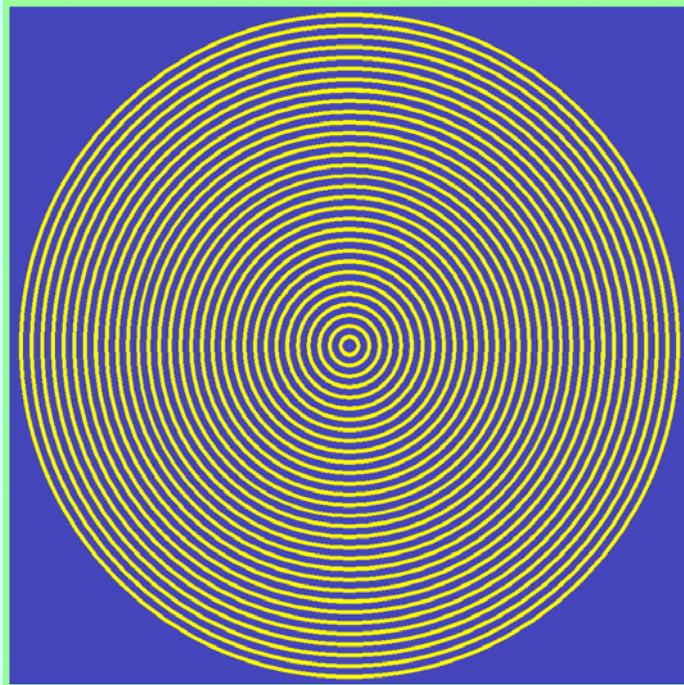


The *measurement properties* of the **conventional Placido disk-based topographers** are rather problematic, as *no point correspondences* are available for the purpose of the geometrical surface reconstruction.



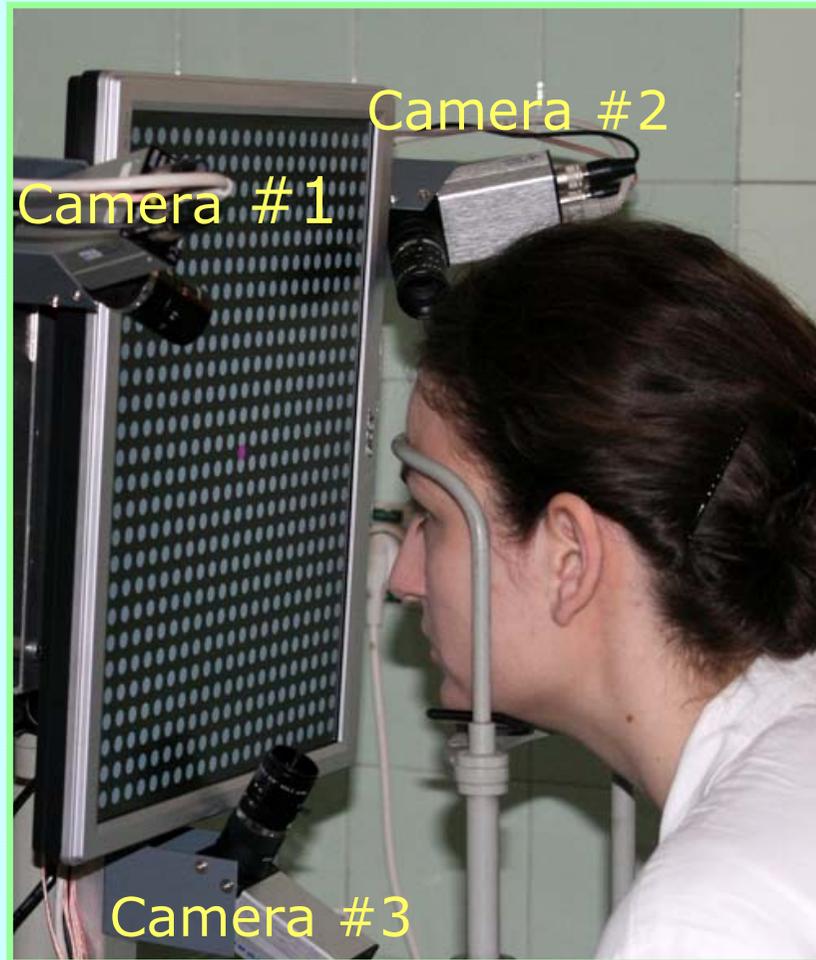
Introduction – Reflective corneal topography and its measurement patterns

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Using some *sophisticated version* of Placido disk, e.g., a ***random-coloured Placido disk***, *point correspondences* can be found for reconstruction.

Introduction – Reflective corneal topography and its measurement patterns 5/7

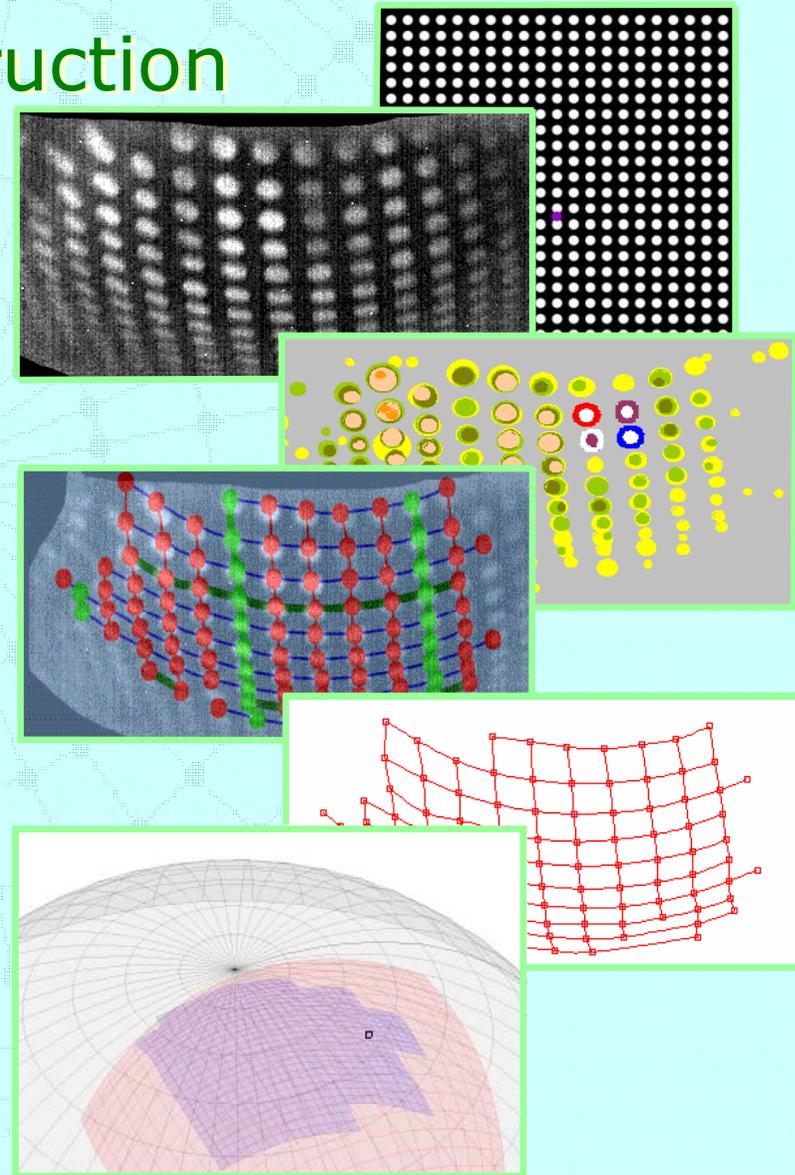


Recently, a **multi-camera surface reconstruction method** was proposed for the purpose of corneal topography. The reconstruction is achieved by solving the **partial differential equations** (PDE's) describing the specular reflections at the corneal surface.

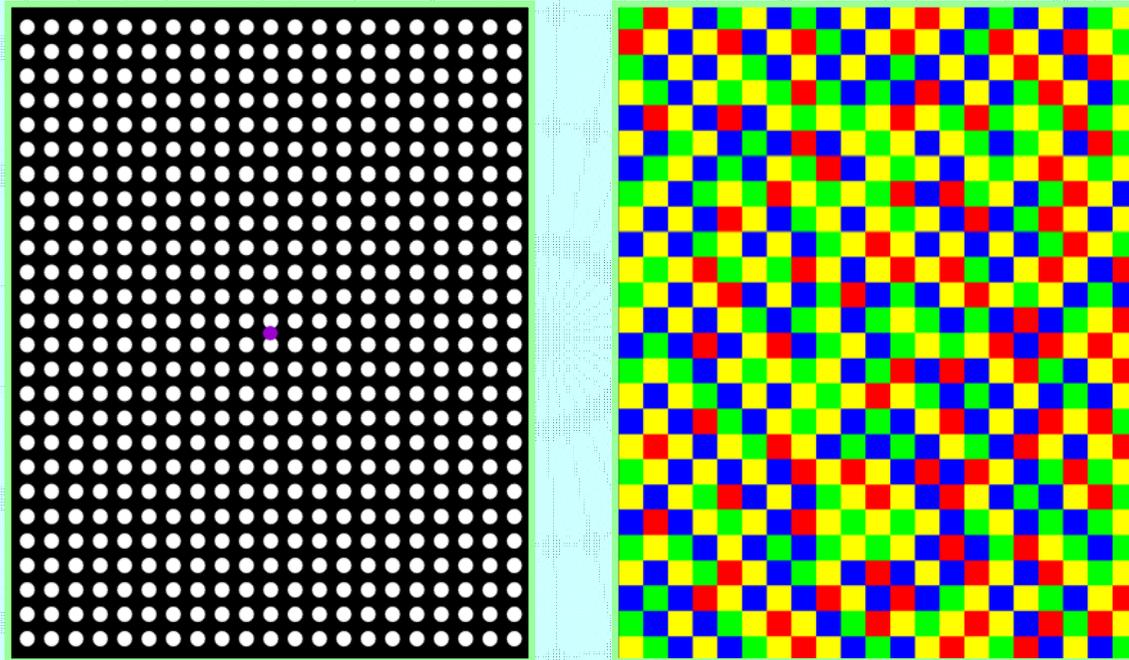
Introduction – Reflective corneal topography and its measurement patterns 6/7

- The process of reconstruction

- *image* segmentation
- *blob* filtering
- blob identification
- *spline* approximation
- numerical integration of the first-order *ordinary differential equations*
- derived from the first-order *PDE's* via appropriate *parametrization*



Introduction – Reflective corneal topography and its measurement patterns 7/7



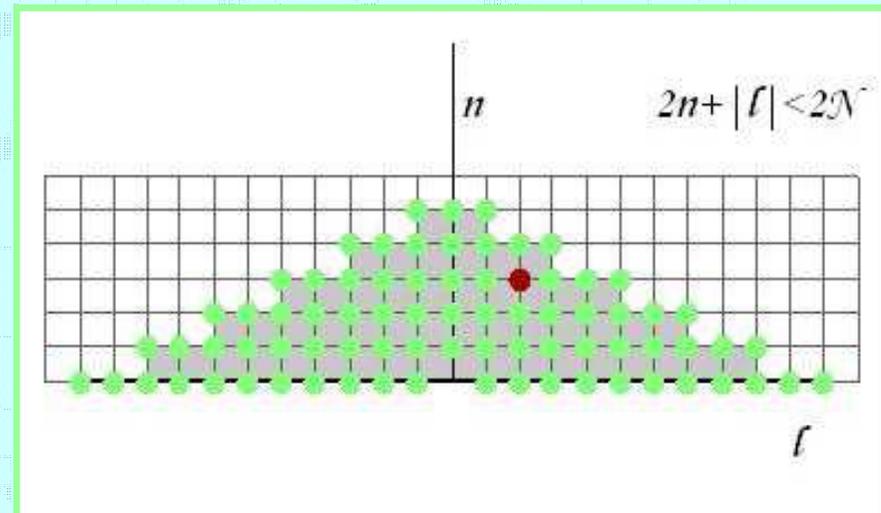
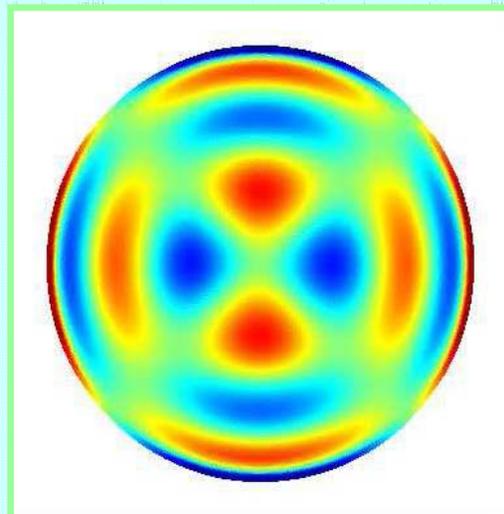
The *measurement patterns* used in the multi-camera topographer arrangement: *a square grid of circular spots* with its centre marked and a *position-coding colour checkerboard*.

Introduction – The orthogonal system of Zernike functions

1/1

- Zernike functions

- introduced by **Frits Zernike**, a Nobel prize-winner physicist
- **to model symmetries** and **aberrations** of **optical systems** (e.g., telescopes)
- various schemes of **normalization** and **numbering**
- an **example** of **Zernike functions**, namely Y_3^2 , is shown below; its **index-pair** is shown as a red dot in the trapezoid-shaped **index-space**



Introduction – Zernike functions in ophthalmology

1/2

- Zernike functions and coefficients
 - nowadays, **ophthalmologists** are quite *familiar* with the *Zernike surfaces* that smoothly wave *over the unit disk*
 - they use these surfaces exactly in the way as was intended by Zernike, that is, to *describe* various *symmetries* and *aberrations* of an **optical system**
 - in this case, of the **human eye**
 - more precisely of the **corneal surface** – measured with some *corneal topographer*
 - of the refractive properties of the **eyeball** – measured with a *Shack-Hartmann wavefront-sensor*
 - the *description* is given in the form of *Zernike coefficients*

Introduction – Zernike functions in ophthalmology

2/2

- The optical aberrations

- may cause serious *acuity problems*, and
- significant factors to be considered in planning of *sight-correcting operations*
- wide range of *statistical data* concerning the *eyes* of various *groups of people* is available for the most important Zernike coefficients
- difficult – or in certain cases impossible – to take high-resolution retinal images without *compensating the aberrations* of the eye, however, by compensating them *high-resolution retinal imaging* can be achieved

Introduction – Discrete orthogonal system of Zernike functions

1/1

- Utilizing discrete orthogonality

- although, the corneal *Zernike coefficients* have always been **obtained from** measurements at *discrete corneal points*
- via computations using **some discretization** of the *continuous Zernike functions*
- the *developers* of these algorithms **could not rely on** the *discrete orthogonality* of Zernike functions
- simply because **no mesh of points ensuring discrete orthogonality was known**
- the discrete orthogonality of Zernike functions was a **target of considerable research** for some time
- **only recently** was a *mesh of points* ensuring discrete orthogonality of the Zernike functions found and **introduced by** Pap and Schipp

Continuous Zernike functions

1/3

- a **surface** over the unit disk can be *described* by a *two-variable function* $g(x, y)$
- the application of the *polar-transform* to variables x and y results in

$$x = \rho \cos \vartheta, \quad y = \rho \sin \vartheta,$$

where ρ and θ are the *radial and the azimuthal variables*, respectively, over the *unit disk*, i.e., where

$$0 \leq \rho \leq 1, \quad 0 \leq \vartheta \leq 2\pi.$$

- using ρ and θ , $g(x, y)$ *can be transcribed* into the following form

$$G(\rho, \vartheta) := g(\rho \cos \vartheta, \rho \sin \vartheta).$$

Continuous Zernike functions

2/3

- the **set of Zernike polynomials** of degree less than $2N$ is as follows

$$Y_n^l(\rho, \vartheta) := \sqrt{2n + |l| + 1} \cdot R_{|l|+2n}^{|l|}(\rho) \cdot e^{il\vartheta}$$

$(l \in \mathbb{Z}, n \in \mathbb{N}, |l| + 2n < 2N)$

- the **radial polynomial** marked above *can be expressed* with **Jacobi polynomials** $P_k^{\alpha, \beta}$ in the following manner:

$$R_{|l|+2n}^{|l|}(\rho) = \rho^{|l|} \cdot P_n^{0, |l|}(2\rho^2 - 1).$$

- *some Zernike polynomials:*

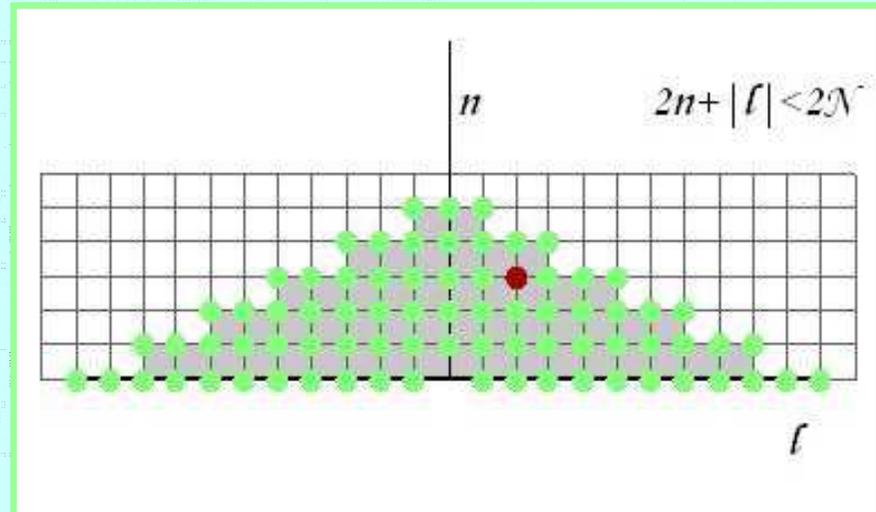
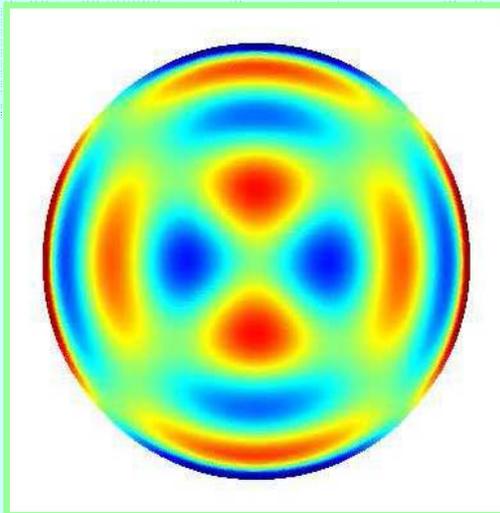
$$R_0^0 = 1, R_2^0 = 2\rho^2 - 1, R_4^0 = 6\rho^4 - 6\rho^2 + 1$$

$$R_1^1 = \rho, R_3^1 = 3\rho^3 - 2\rho.$$

Continuous Zernike functions

3/3

- *an example of Zernike functions*, namely Y_3^2 , is shown in a pseudo-colour representation
- the *index-space* is shown for $N = 6$, that is, for the *set of Zernike polynomials of degree less than 12*



Discretization of Zernike functions — Mesh ensuring the discrete orthogonality of Zernike functions

1/4

- the mesh, or the *set of nodal points* proven to *ensure* the *discrete orthogonality of Zernike functions* (over this mesh) is as follows:

$$X_N := \{z_{jk} := (\rho_k^N, \frac{2\pi j}{4N+1}) : k = 1, \dots, N, j = 0, \dots, 4N\},$$

where

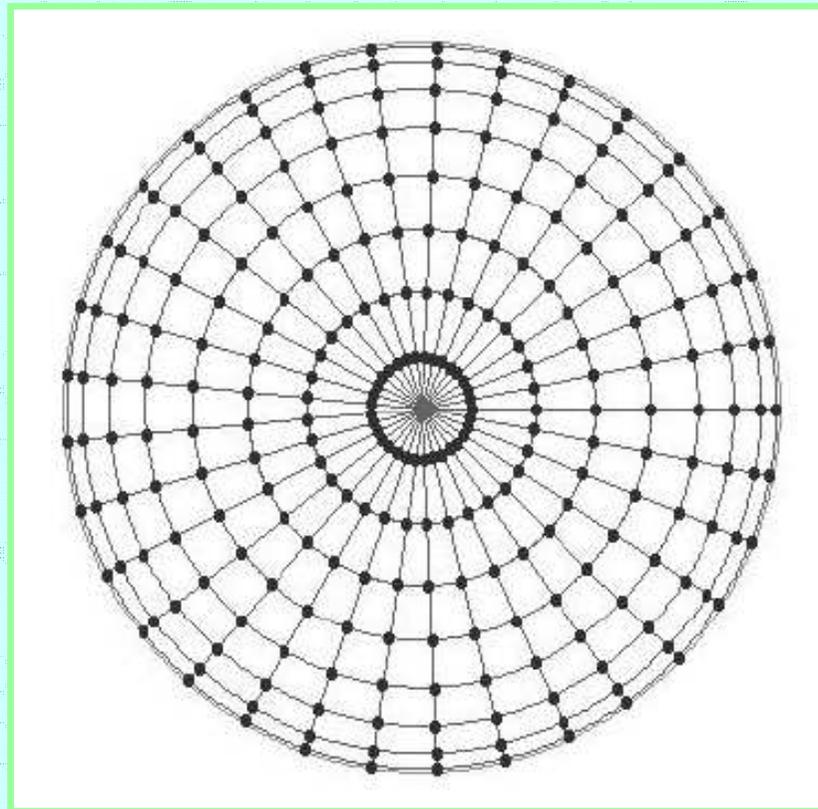
$$\rho_k^N := \sqrt{\frac{1 + \lambda_k^N}{2}}, \quad k = 1, \dots, N.$$

λ_k^N is the *k-th root* of the *Legendre polynomial* P_N of order N

Discretization of Zernike functions — Mesh ensuring the discrete orthogonality of Zernike functions

2/4

- *set of nodal points* X_8



Discretization of Zernike functions — Mesh ensuring the discrete orthogonality of Zernike functions

3/4

- by using the following **discrete integral**

$$\int_{X_N} f(\rho, \phi) d\nu_N := \sum_{k=1}^N \sum_{j=0}^{4N} f(\rho_k^N, \frac{2\pi j}{4N+1}) \frac{A_k^N}{2(4N+1)}$$

the **discrete orthogonality** of the Zernike functions **can be proven**

- the marked **weights** are associated with the **discrete circular rings** in the mesh
- the **discrete orthogonality relation** is as follows

$$\int_X Y_n^m(\rho, \phi) \overline{Y_{n'}^{m'}(\rho, \phi)} d\nu_N = \delta_{nn'} \delta_{mm'}$$

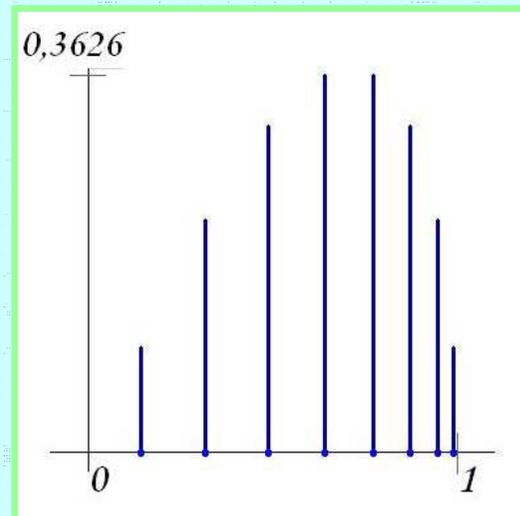
$$n + n' + |m| < 2N$$

$$n + n' + |m'| < 2N$$

Discretization of Zernike functions — Mesh ensuring the discrete orthogonality of Zernike functions

4/4

- the *weights* A_1^8, \dots, A_8^8



Discretization of Zernike functions — Significance of the quadrature formulas 1/1

- **quadrature formulas** are known for some well-researched *continuous orthogonal polynomials* of one variable since *Gauss's* time
- these are expressed in the following way:

$$\int_{-1}^1 f(x) dx \approx \sum_{k=1}^N f(\lambda_k^N) A_k^N.$$

- the **integration of function** $f(x)$ using its *quadrature formula* is much *more precise* than a numerical integration using *over some arbitrary*, e.g., equidistant mesh
- in our case, that is, **for the discretization of the radial Zernike polynomials** the N roots of *Legendre-polynomials* P_N were used
- though, the *formula* for deriving the weights is not given here, it is **exact for every polynomial** f of order less than $2N$

The discrete Zernike coefficients

1/4

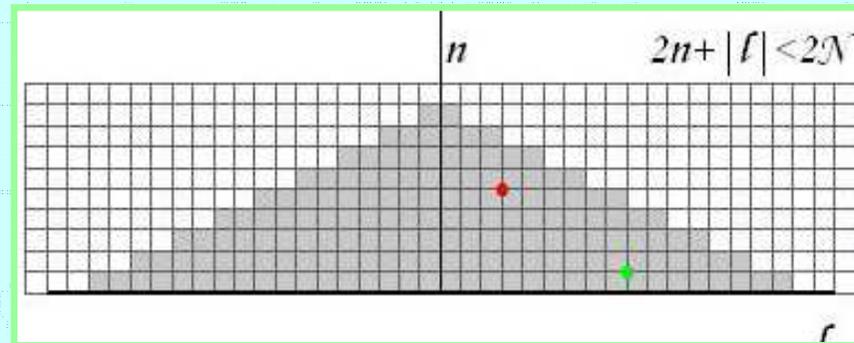
- the *discrete Zernike coefficients* associated with function $T(\rho, \theta)$ can be calculated with the following *discrete integral*

$$C_n^m = \frac{1}{\pi} \int_{X_N} T(\rho, \phi) \overline{Y_n^m(\rho, \phi)} d\nu_N.$$

- if $T(\rho, \theta)$ happens to be an *arbitrary linear combination of Zernike functions* of degree less than $2N$, then the above *discrete integrals*
- for n 's and m 's satisfying the inequality $2n + |m| < 2N$
- result in the *exact Zernike coefficients*, i.e., the ones that are calculated from the corresponding continuous integrals

The discrete Zernike coefficients — Program implementation 2/4

- a *program implementation* was developed for computing the discrete Zernike coefficients
- with the developed program, the *precision of the discrete orthogonality* can be checked for the mesh of points

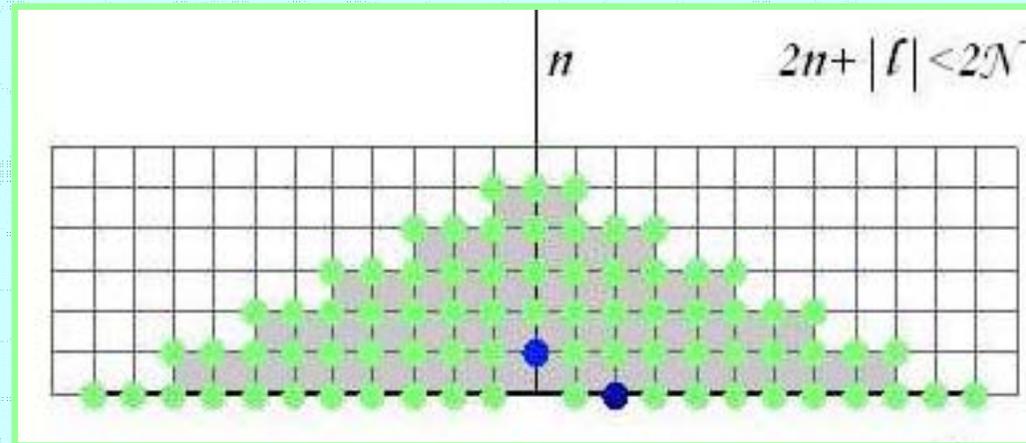
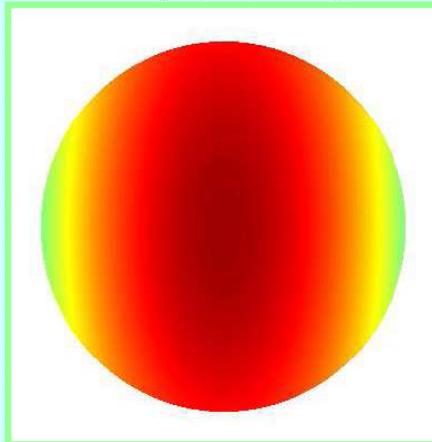


- the *precision of the discrete orthogonality* for the above index-set and for its corresponding mesh, for the two Zernike functions (with the marked indices) the *error* was $3.8 \cdot 10^{-18}$

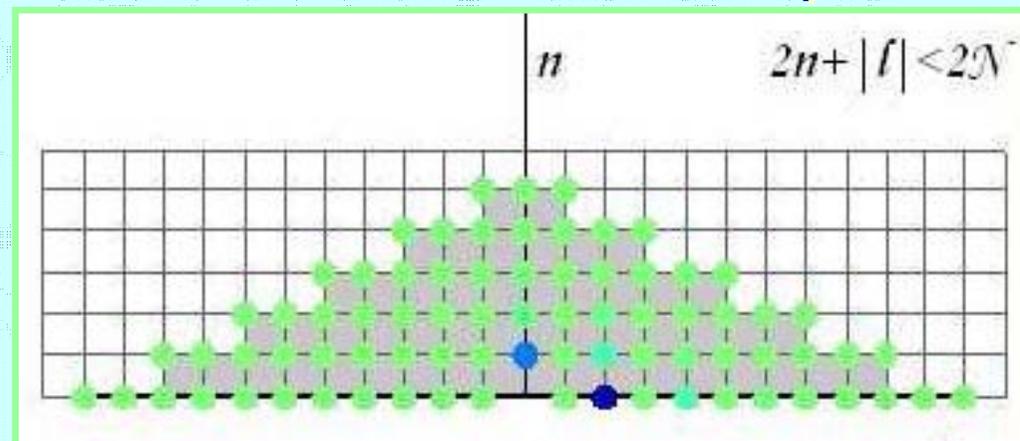
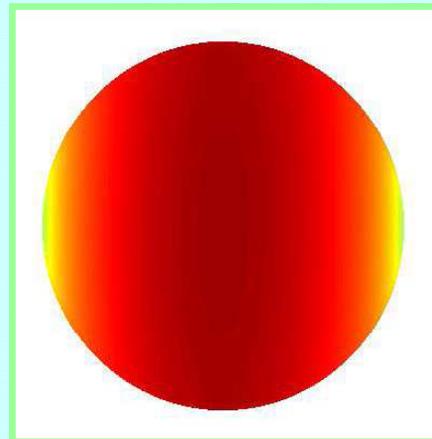
The discrete Zernike coefficients — Examples

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- the *input functions* were selected from the *test surfaces for corneal topographers*

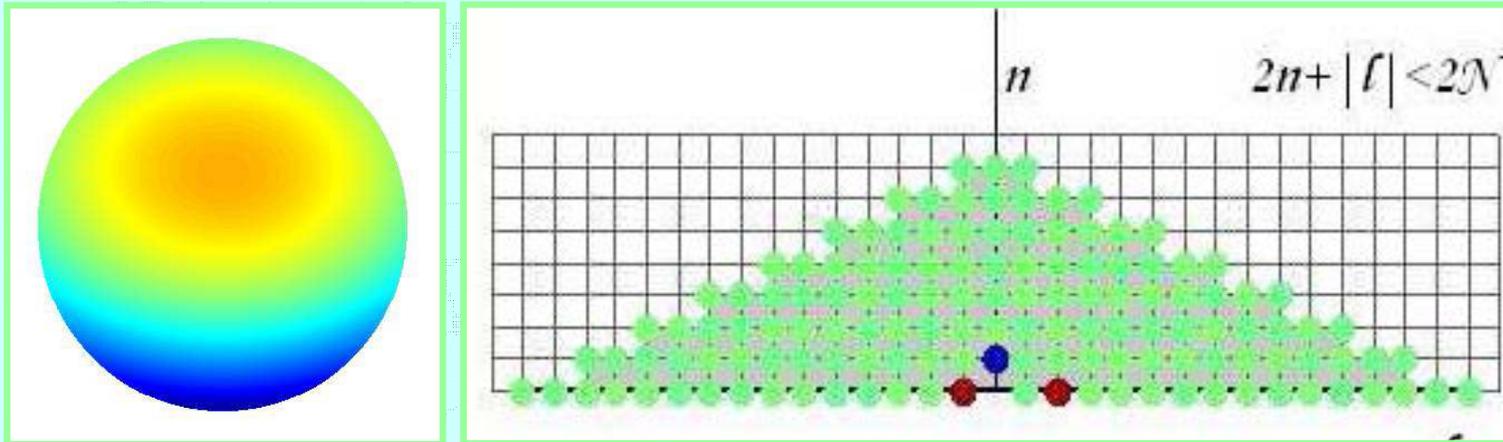


- *two sphero-cylindrical surfaces* and their Zernike coefficients, note that the lower one is more cylindrical



The discrete Zernike coefficients — Program implementation 3/4

- the *input functions* were selected from the *test surfaces for corneal topographers*



- a *surface modelling a deformed cornea, called keratoconus, and its active Zernike coefficients*

Conclusions and future work 1/1

- the **discretization** used in this paper was proposed by Pap and Schipp
- it has **relevance to the concrete application field**, but could **also benefit physicists and engineers** dealing with optical measurements and measurement devices
- however, **using this mesh as a measurement-pattern** in a reflective corneal topographer **will not result in** a sampling that ensures **discrete orthogonality** of the Zernike functions **as the corneal surfaces does not have a standard shape**
- **to benefit in reflective corneal topography from the discretization** used in this paper, the **optical system** – together with the **internal control mechanism** – of the topographer must ensure that the **sampling points on the corneal surface** are positioned **according to the mesh** with respect to the optical axis of the camera
- the above requirement is best achieved by some **adaptive optical mechanism and appropriate control**

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