

# ***Possible AI applications in Optometry***



**Massimo Gurioli (UNIFI)**



REVIEW

## Artificial Intelligence for Anterior Segment Diseases: A Review of Potential Developments and Clinical Applications

Zhe Xu · Jia Xu · Ce Shi · Wen Xu · Xiuming Jin · Wei Han · Kai Jin · Andrzej Grzybowski · Ke Yao

## Applications of Artificial Intelligence in Myopia: Current and Future Directions

Chenchen Zhang, Jing Zhao, Zhe Zhu, Yanxia Li, Ke Li, Yuanping Wang and Yajuan Zheng\*

Department of Ophthalmology, The Second Hospital of Jilin University, Changchun, China



Systematic Review

## Keratoconus Diagnosis: From Fundamentals to Artificial Intelligence: A Systematic Narrative Review

Sana Niazi<sup>1</sup>, Marta Jiménez-García<sup>2,3</sup> , Oliver Findl<sup>4</sup> , Zisis Gatziooufas<sup>5</sup>, Farideh Doroodgar<sup>1,6,\*</sup> , Mohammad Hasan Shahriari<sup>7</sup> and Mohammad Ali Javadi<sup>8</sup>

## Deep Learning Classifiers for Automated Detection of Gonioscopic Angle Closure Based on Anterior Segment OCT Images

Benjamin Y. Xu, MD, PhD<sup>1</sup>, Michael Chiang, PhD<sup>2</sup>, Shreyasi Chaudhary, BS<sup>3</sup>, Shraddha Kulkarni, BS<sup>3</sup>, Anmol A. Pardeshi, MS<sup>1</sup>, Rohit Varma, MD, MPH<sup>4</sup>

Open Access



## Corneal power evaluation after myopic corneal refractive surgery using artificial neural networks

Robert Konrowski<sup>1\*</sup>, Michele Lanza<sup>2,3</sup> and Carlo Innocenti<sup>3</sup>

REVIEW ARTICLE

OPEN

## Artificial Intelligence for Cataract Detection and Management

Jo

Int J Ophthalmol. Vol. 16, No. 9, Sep. 18, 2023 www.ijo.cn  
 Tel: 8629-82245172 8629-82210956 Email: ijopress@163.com

ha Anees, MSc

• Intelligent Ophthalmology •

## Bibliometric analysis of artificial intelligence and optical coherence tomography images: research hotspots and frontiers

Hai-Wen Feng<sup>1</sup>, Jun-Jie Chen<sup>1</sup>, Zhi-Chang Zhang<sup>2</sup>, Shao-Chong Zhang<sup>3</sup>, Wei-Hua Yang<sup>3</sup>

## ***OUTLINE (ideas for AI application on open items in our group):***



- 1. Diagnostic Assistance: AI algorithms can help in detecting various eye conditions***
- 2. TeleRefraction: AI-powered device can perform automatic refraction tests***



- 3. Hybrid image designs for screenings: ?May AI optimize them?***

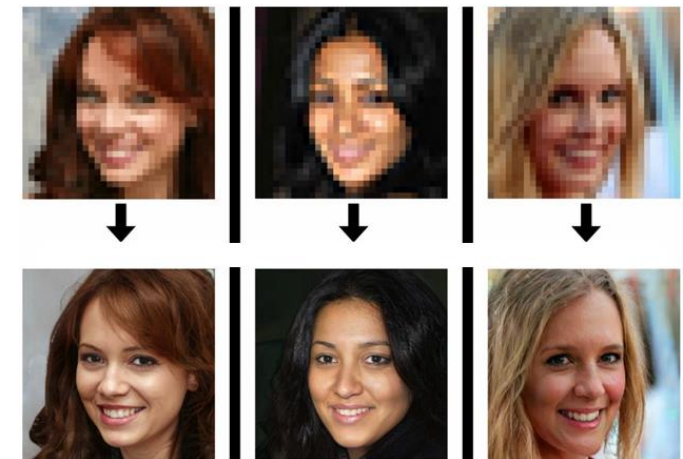
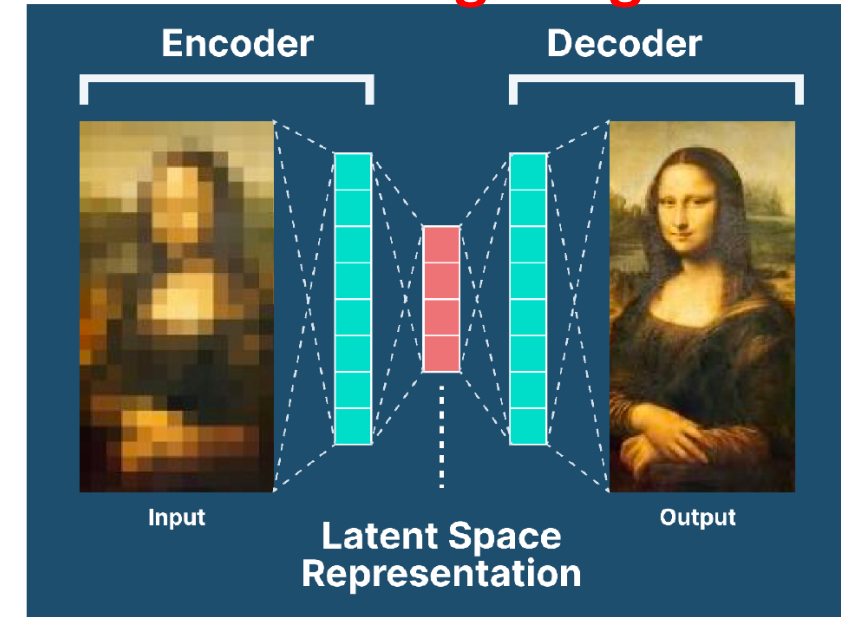


- 4. Understanding human colour perceptions: ?? May AI help in understanding human brain??***

# Optometry is based on images

Imaging modalities	Image features	Application
Slit-lamp images	Slit light	Cataract detection and grading
	Diffuse light	Conjunctival hyperemia grading
		Cataract detection and grading
Retro-illumination	High intraocular pressure detection	Identification, localization of conjunctiva, cornea and lens diseases
		Posterior capsule opacification progress prediction
AS-OCT images	Angle-closure detection	
Tear film lipid layer interference images	Tear Film Lipid Layer Classification	Dry eye diagnosis
Frontal eye videos after fluorescein instillation	Dry eye detection, BUT calculation	
Retinal fundus images	Cataract grading	
Visible wavelength image by digital camera	Corneal arcus and cataract detection	

AI is very efficient  
«denoising images»



# Research @ UNIFI



Ministero dell'Università e della Ricerca

Segretariato Generale

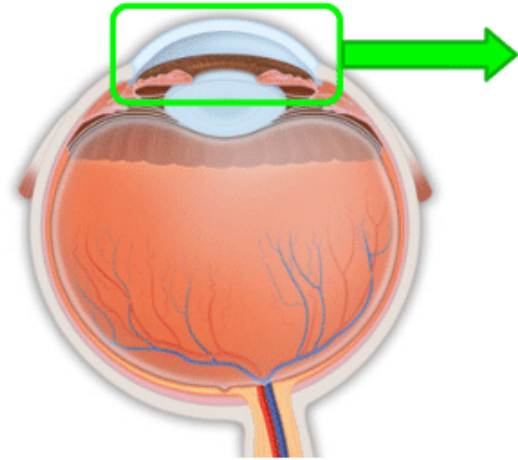
Direzione Generale della Ricerca

PRIN: PROGETTI DI RICERCA DI RILEVANTE INTERESSE NAZIONALE – Bando 2022  
Prot. 2022E3W8KE

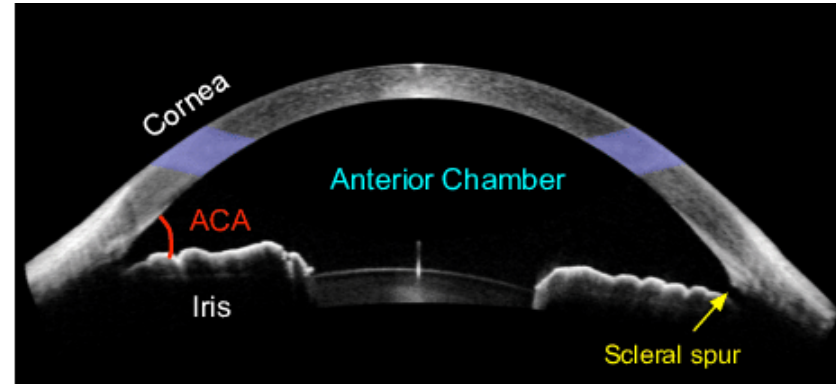
PART A

1. Research project title

Anterior Eye Normative data from new technologies of imaging  
to improve primary Eye Assistance Services (AENEAS) \bold(A)



(A) Anterior segment of eyeball

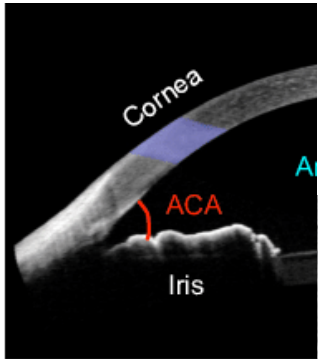


## Tomography of anterior eye by OCT e Scheimpflug

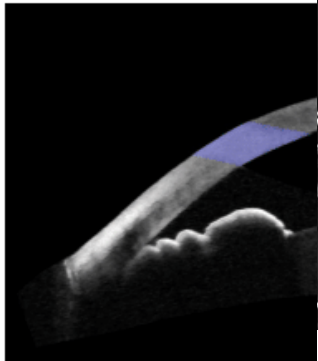
Anterior Eye Normative data from new technologies of imaging  
to improve primary Eye Assistance Services (AENEAS)

# help in detecting various eye conditions

## Closure of angle



(B)



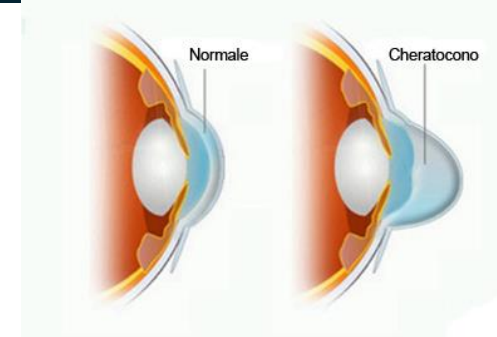
(C) Angle-closure

ORIGINAL ARTICLE · Volume 119, Issue 11, P2231-2238, November 2012

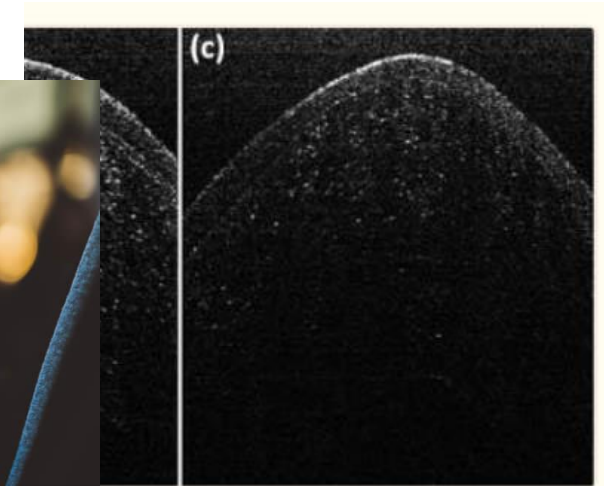
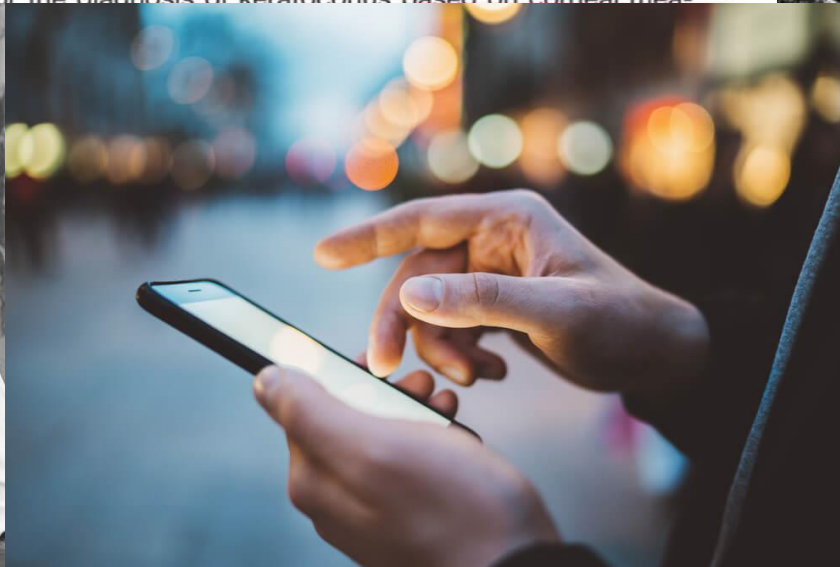
[Download Full Issue](#)

### Use of a Support Vector Machine for Keratoconus and Subclinical Keratoconus Detection by Topographic and Tomographic Data

Maria Clara Arbelaez, MD<sup>1</sup> · Francesco Versaci, MSE<sup>2</sup> · Gabriele Vestri, MSE<sup>2</sup> · Piero Barboni, MD<sup>3</sup> · Giacomo Savini, MD<sup>4</sup>



**Purpose:** To define a new classification method for the diagnosis of keratoconus based on corneal mea-



keratoconus (c) severe keratoconus.

92.8% to 95.0% in eyes with keratoconus, 75.2% to 92.0% in eyes with subclinical keratoconus, and 93.1% to 97.2% in normal eyes.

# 2- Telerefraction (PhD. Founded by ESSILORLUXOTTICA)



www.nature.com/eye

KJO  
pISSN: 1011-8942 eISSN: 2092-9382

Check for updates  
Korean J Ophthalmol 2023;37(2):95-104  
https://doi.org/10.3341/kjo.2022.0059

ARTICLE

Deep learning for predicting uncorrected refractive error using posterior segment optical coherence tomography images

Tae Keun Yoo<sup>1,2,3</sup>, Ik Hee Ryu<sup>1,3</sup>, Jin Kuk Kim<sup>1,3</sup> and In Sik Lee<sup>1,3</sup>

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Check for updates



Original Article

Deep Learning-based Prediction of Axial Length Using Ultra-widefield Fundus Photography

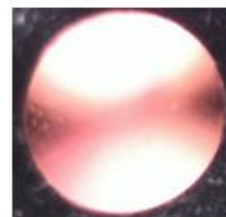
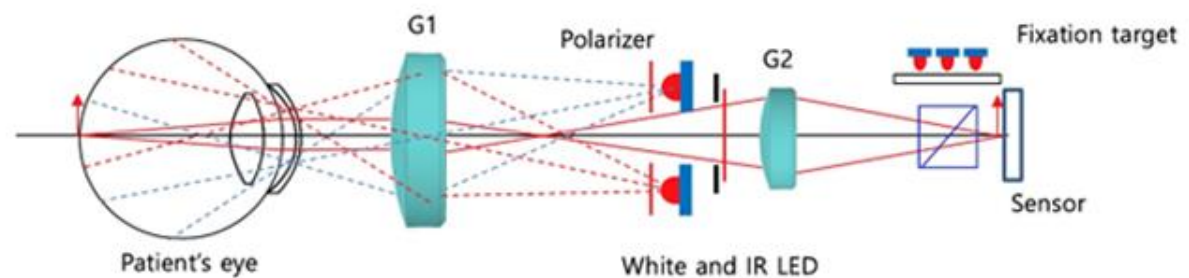
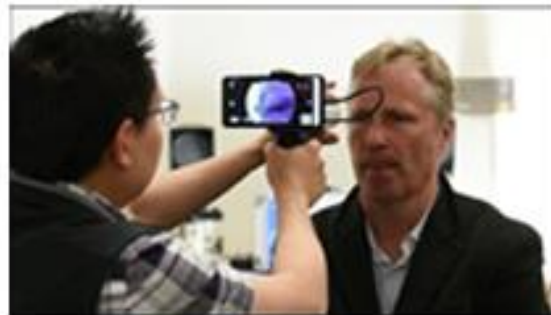
Yichul Oh<sup>1</sup>, Eun Kyoung Lee<sup>1,2</sup>, Kunho Bae<sup>1,2</sup>, Un Chul Park<sup>1,2</sup>, Hyeong Gon Yu<sup>1,2</sup>, Chang Ki Yoon<sup>1,2</sup>

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Article

## Automatic Refractive Error Estimation Using Deep Learning-Based Analysis of Red Reflex Images

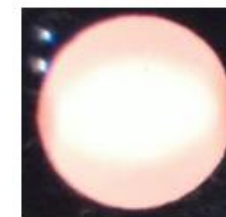
Glenn L Scott Dc



Sphere value: -8 (myopic)



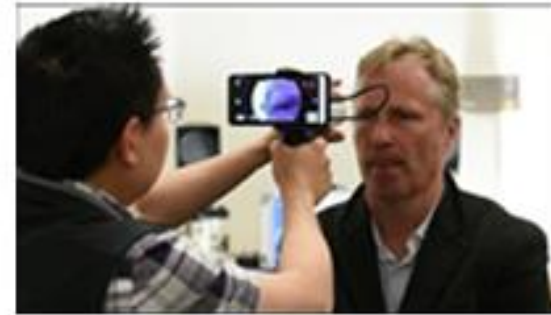
Sphere value: 0 (normal vision)



Sphere value: +10 (hyperopia)

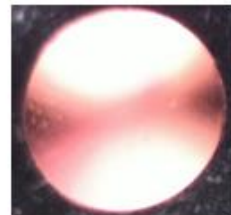
Article

## Automatic Refractive Error Estimation Using Deep Learning-Based Analysis of Red Reflex Images



**Abstract: Purpose:** We evaluate how a deep learning model can be applied to **extract refractive error metrics from pupillary red reflex images taken by a low-cost handheld fundus camera.** This could potentially provide a rapid and economical vision-screening method, allowing for early intervention to prevent myopic progression and reduce the socioeconomic burden associated with vision impairment in the later stages of life.

**Results:** The best-performing trained model achieved an overall accuracy of 75% for predicting spherical power using infrared images and a multiclass classifier.



Sphere value:  $-8$   
(myopic)



Sphere value:  $0$   
(normal vision)



Sphere value:  $+10$   
(hyperopia)



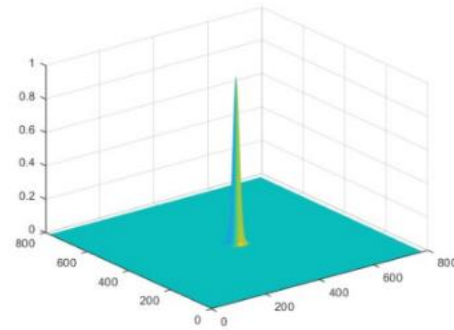
**Hybrid images  
designs for  
optometric  
screenings**



## How we do hybrid images



(a) Original image of a dog  $I_1$



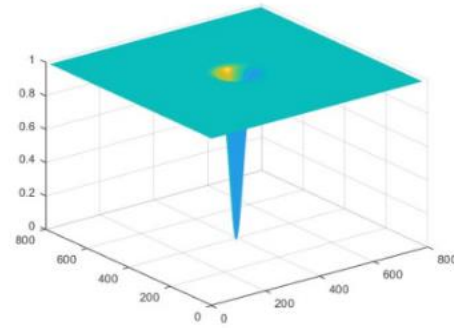
(b) Low pass filter  $G_1$



(c) Filtered image  $I_L$



(d) Original image of a sheep  $I_2$



(e) High pass filter  $(1 - G_2)$



(f) Filtered image  $I_H$

### IMPORTANT PARAMETERS

- Selecting images
- Selecting cut off frequencies

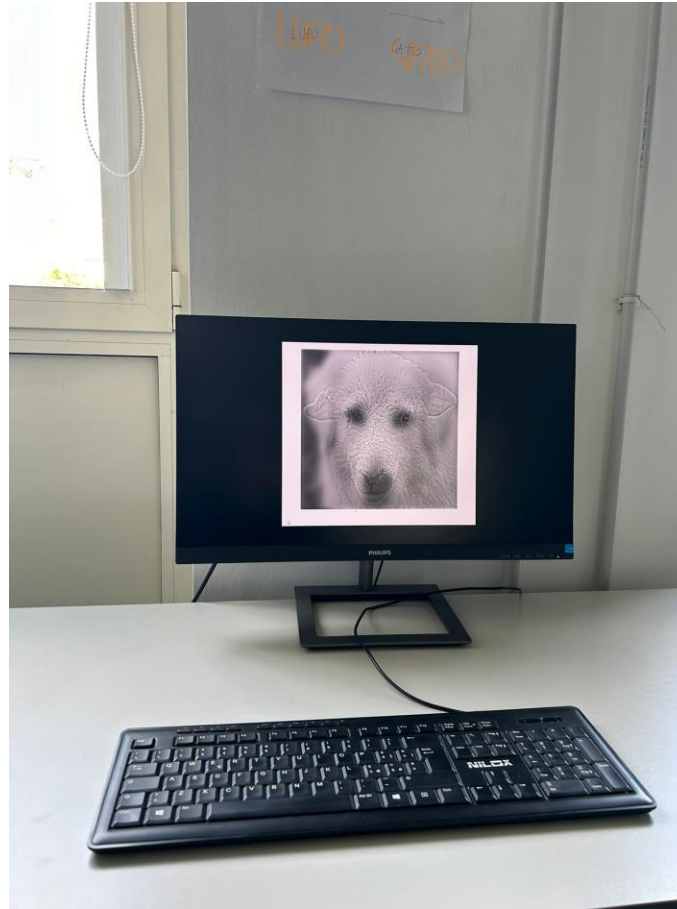


## Tests of the screening

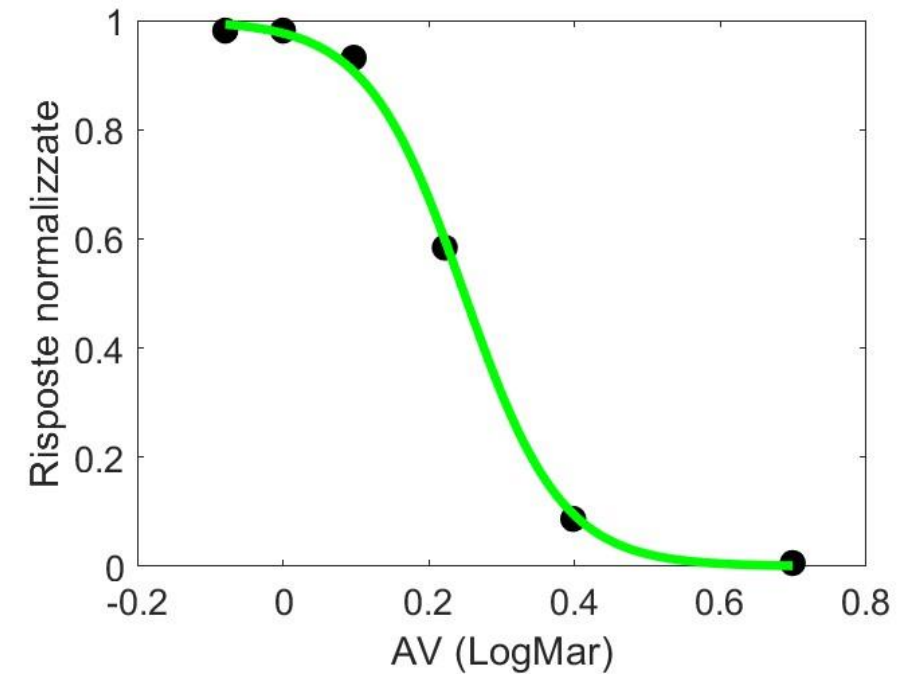
### 1. Miopization



### 2. Hybrid Image



### 3. Psychometric response

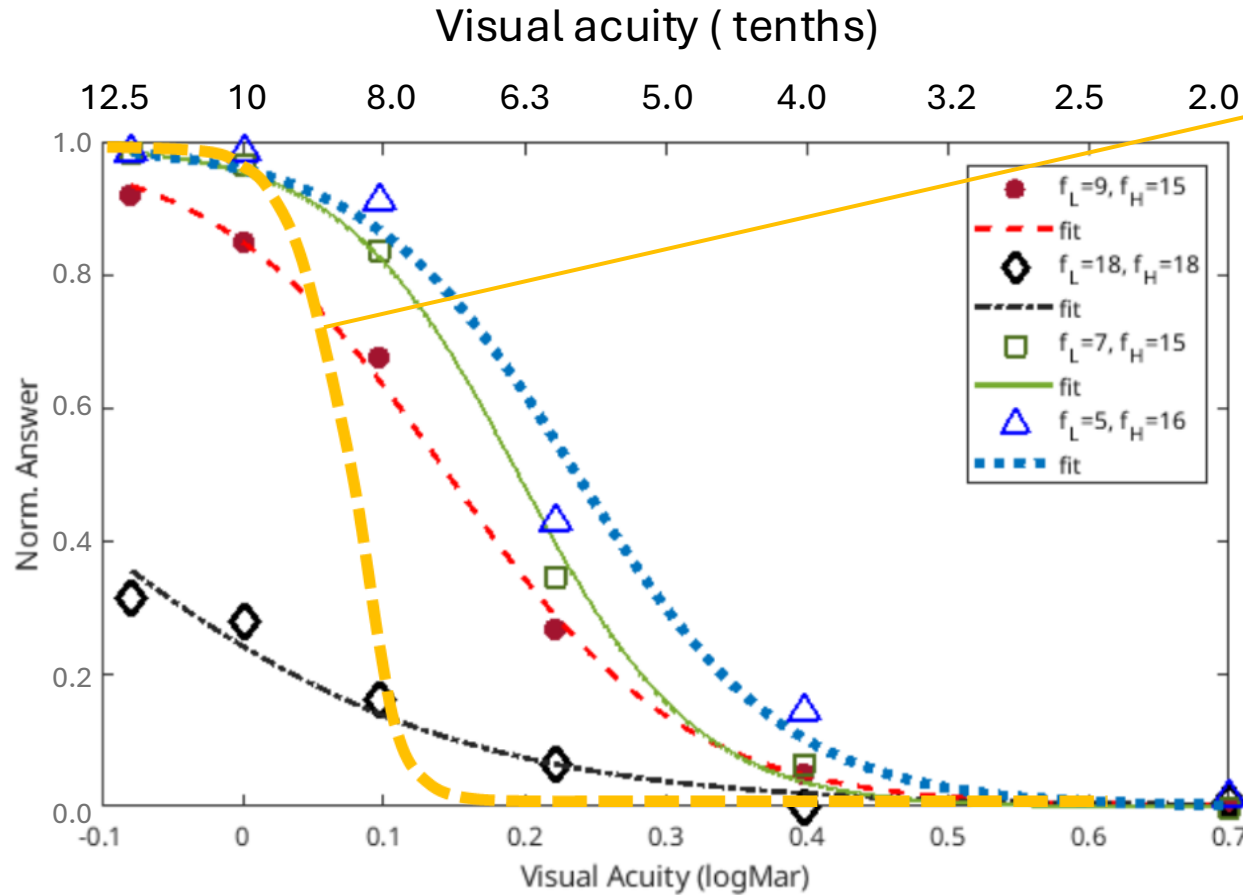




**Optometric Screening**

suitable for non specialists for testing very small kids for

**control of miopic progression**



**Ideal psychometric**

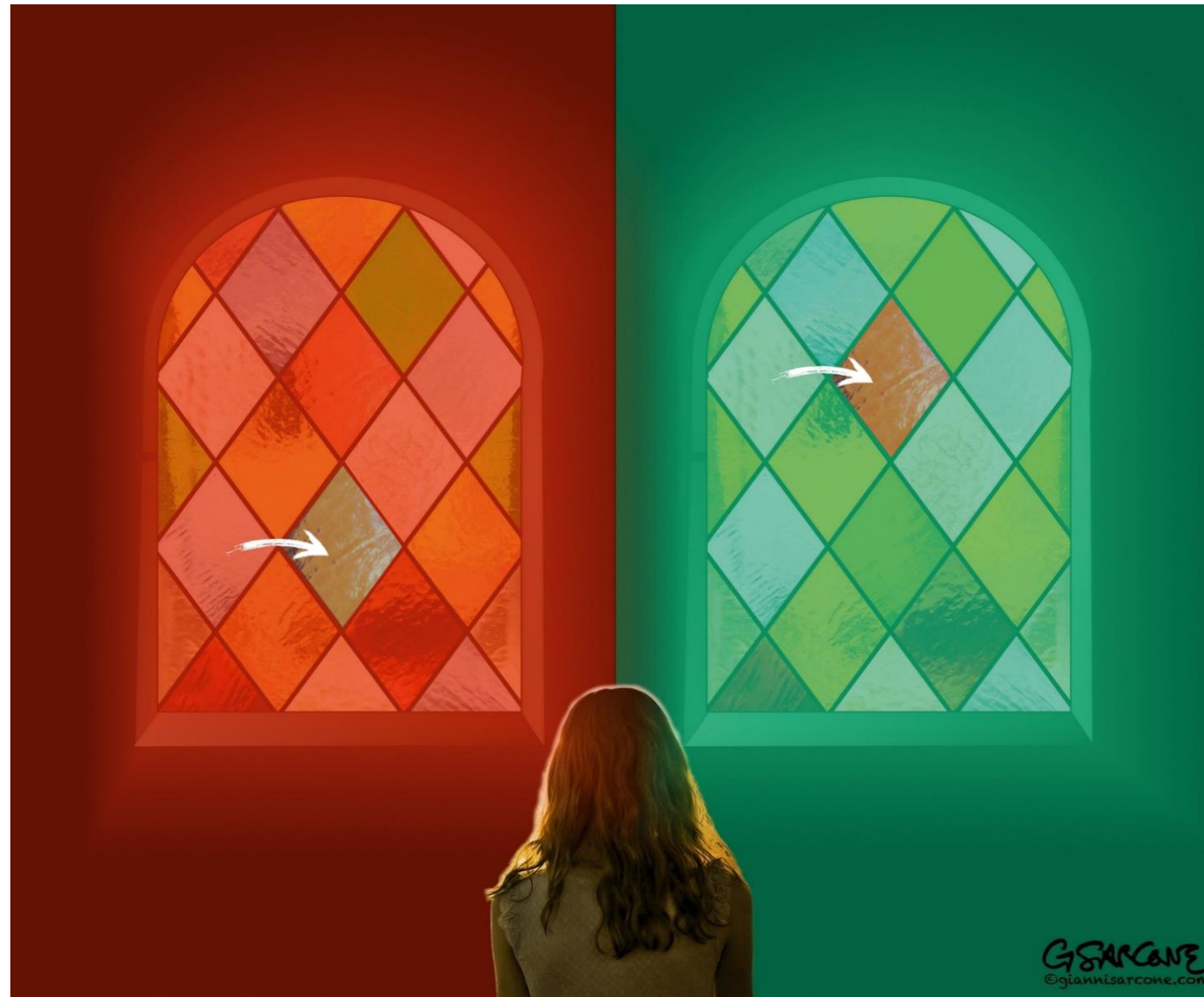
**IMPORTANT PARAMETERS**

- **Selecting images**
- **Selecting cut off frequencies**

May AI optimize a hybrid image to get an almost ideal psychometric response?

**Figure 3.** Psychometric fit of four versions of the “sheep-dog”-HI. The cutoff frequencies in the legend are expressed in cycles/set.

# Chromatic illusion

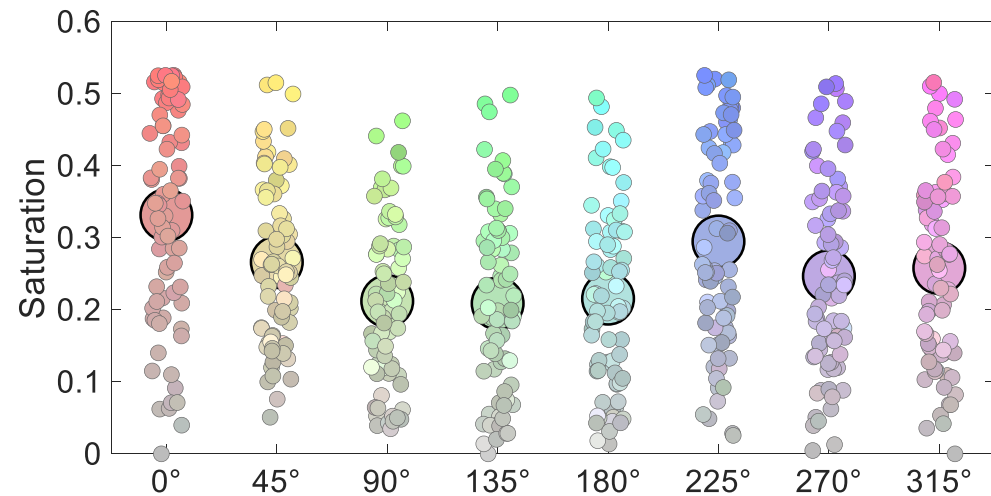
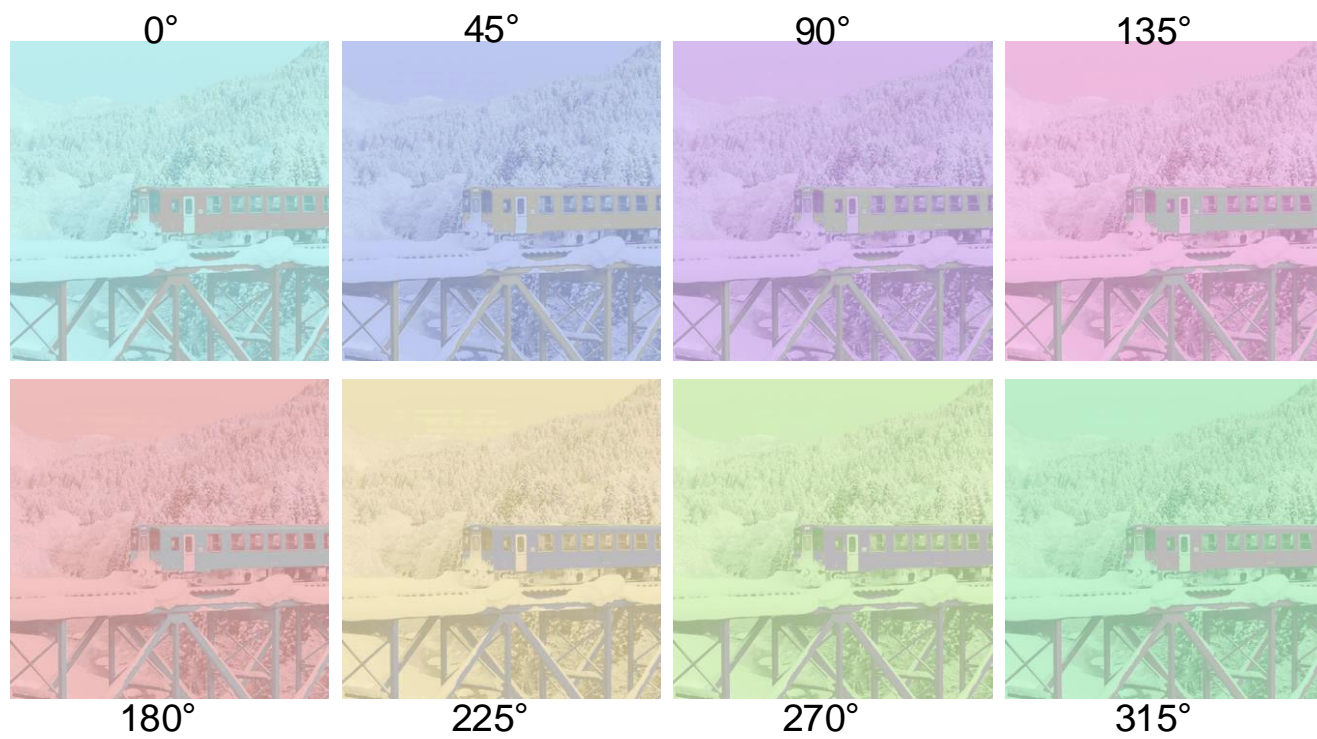


<https://www.giannisarcone.com/>

**Gray looks  
reddish**

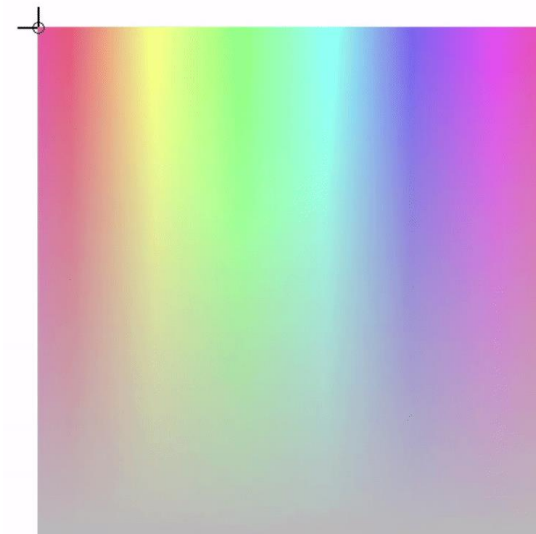


## 4. Colour perception



**Test on many people**

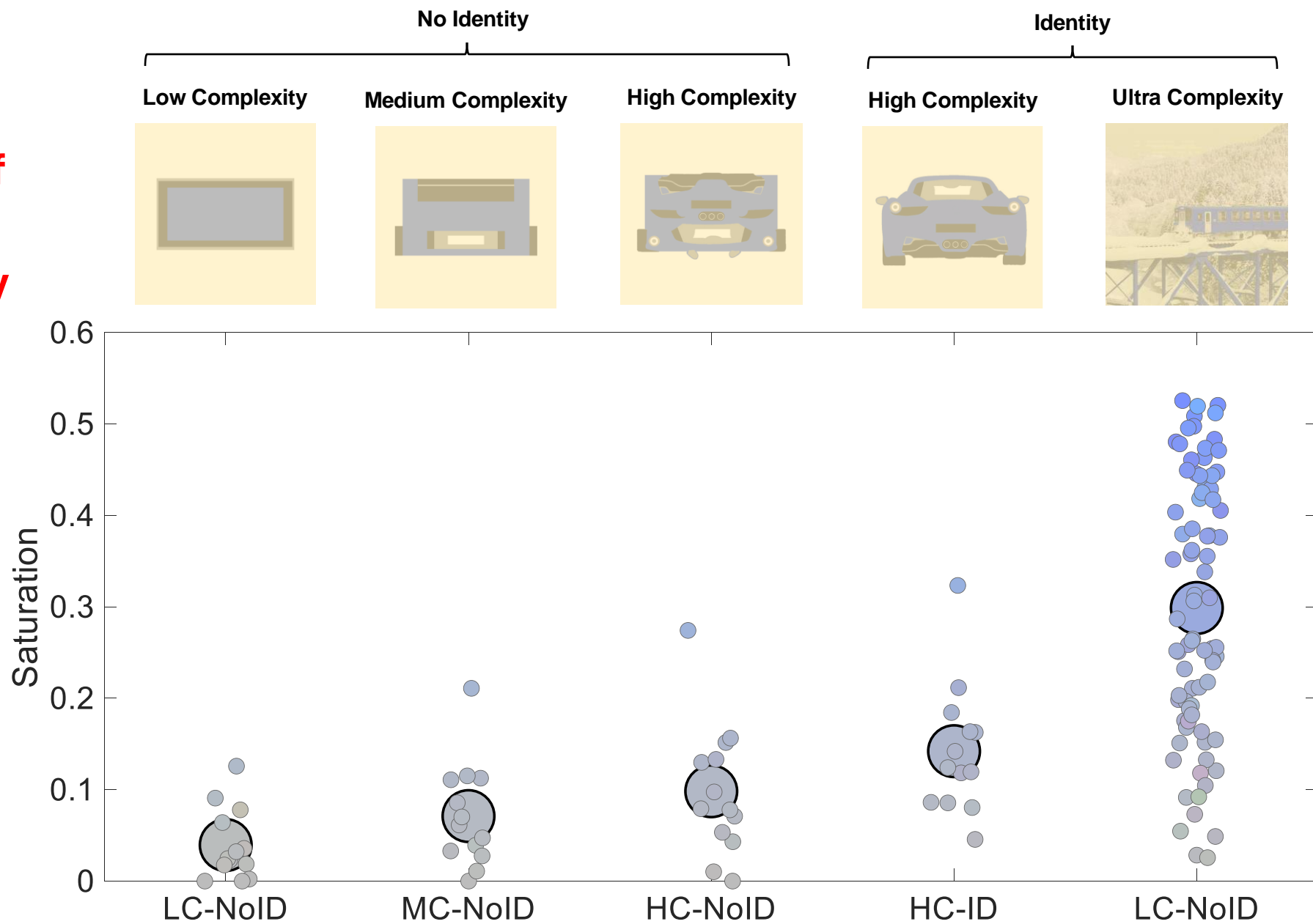
Selection of the colour



Selection of the colour

## 4. Colour perception

Test as a function of image complexity

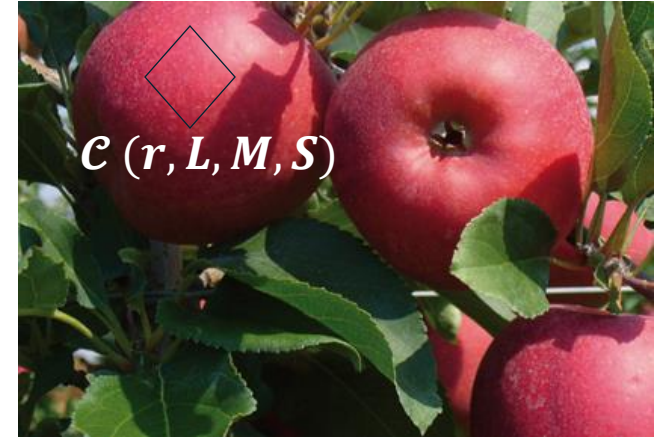




## «NORMAL» COLOURS

$$C(r, L, M, S) = C'(r, L, M, S)$$

$$C'(r, L, M, S)$$



## «ILLUSION» COLOUR

$$C(r, L, M, S) \neq C'(r, L, M, S)$$

$$C'(r, L, M, S)$$



The brain does a lot of operation for presenting us the chromatic perception of the world.

## «ILLUSION» COLOUR

$$\mathcal{C}(r; L, M, S) \neq \mathcal{C}'((r; L, M, S))$$

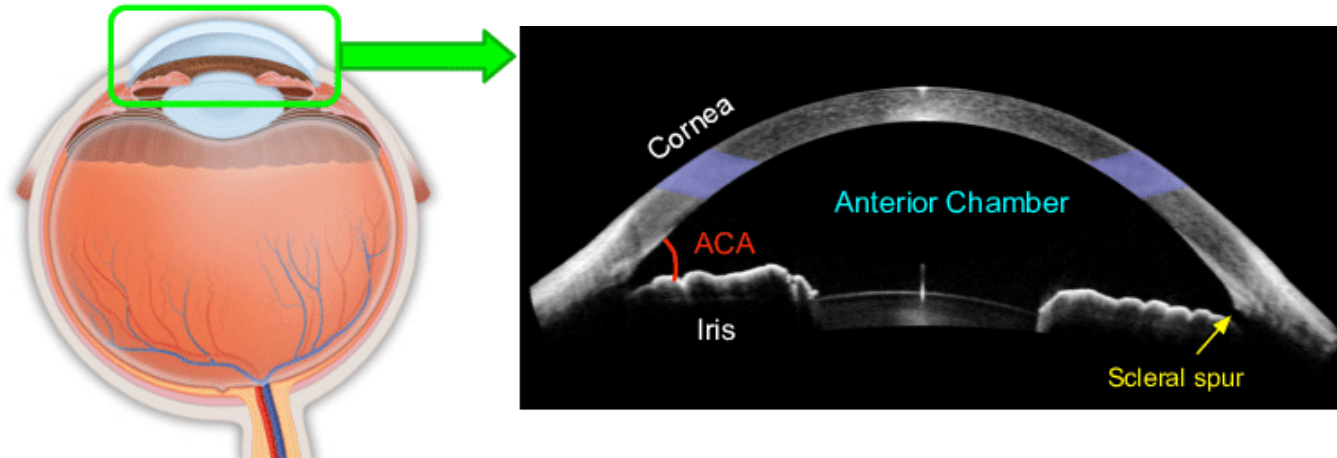


In summary: **chromatic perception is non-local**

$$\mathcal{C}(r; L, M, S) = \int dr' K(r - r') \mathcal{C}'((r'; L', M', S'))$$

**??** May AI help us in understanding the shape of the kernel  $K(r - r')$  **??**

# 1a. Increasing OCT resolution



(A) Anterior segment of eyeball

**STRADA STANDARD:**  
*La risoluzione assiale di OCT dipende dalla larghezza spettrale della sorgente luminosa*

$$\Delta z = \frac{2 \ln 2}{\pi} \frac{\lambda^2}{\Delta \lambda}$$

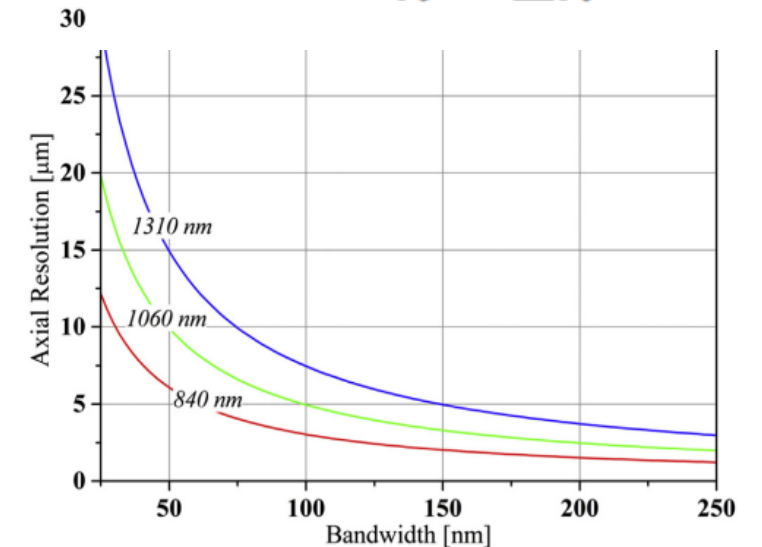


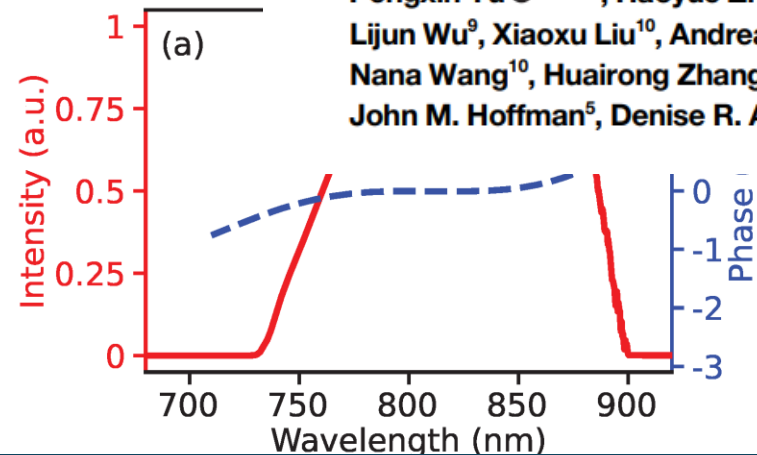
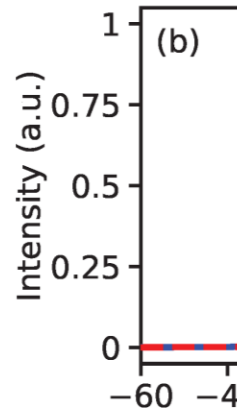
Fig. 2. Axial resolution vs. bandwidth for the typical optical coherence tomography light source center wavelengths of 840, 1060, and 1310 nm.

Clinical Trials

Measurement of Te Resolution Optical

René M. Werkmeister,<sup>1</sup> Aneesh Jasmin Riedl,<sup>1</sup> Michael Bronhagl, Gerhard Garhöfer,<sup>2</sup> Wolfgang Dr and Leopold Schmetterer<sup>1,2</sup>

<sup>1</sup>Center for Medical Physics and Biomedical Optics  
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<sup>3</sup>Institute



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Published in partnership with Seoul National University Bundang Hospital

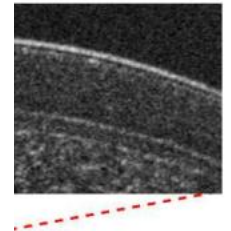
Article



Vol. 54 | No. 8 | 5579

<https://doi.org/10.1038/s41746-024-01338-8>

# Spatial resolution enhancement using deep learning improves chest disease diagnosis based on thick slice CT



Check for updates

Pengxin Yu<sup>1,2,3,16</sup>, Haoyue Zhang<sup>4,5,16</sup>, Dawei Wang<sup>3</sup>, Rongguo Zhang<sup>6</sup>, Mei Deng<sup>7</sup>, Haoyu Yang<sup>8</sup>, Lijun Wu<sup>9</sup>, Xiaoxu Liu<sup>10</sup>, Andrea S. Oh<sup>5</sup>, Fereidoun G. Abtin<sup>5</sup>, Ashley E. Prosper<sup>5</sup>, Kathleen Ruchalski<sup>5</sup>, Nana Wang<sup>10</sup>, Huairong Zhang<sup>11</sup>, Ye Li<sup>12</sup>, Xinna Lv<sup>12</sup>, Min Liu<sup>13</sup>, Shaohong Zhao<sup>9</sup>, Dasheng Li<sup>10</sup>, John M. Hoffman<sup>5</sup>, Denise R. Aberle<sup>5</sup>, Chaoyang Liang<sup>14</sup>, Shouliang Qi<sup>1,2</sup>✉ & Corey Arnold<sup>15</sup>✉



FIGURE 1. Sample measurement of human precorneal tear film using ultrahigh-resolution OCT. TF, tear film; EP, corneal epithelium; BL, Bowman's layer; ST, corneal stroma; DM, Descemet's membrane; ED, corneal endothelium.

Risoluzione del film lacrimale, lamina di Bowman, membrana di Descemet.....