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## Anatomy and microstructure of cervix

**Female reproductive system**

**Ectocervix**

- Ectocervix covered by a non-vascularized epithelium.
- Three main epithelial regions: **Squamous**, **Columnar**, and **Metaplastic Epithelium** or **Metaplasia**
- **Connective tissue** composed of collagen I, elastin, and blood vessels
- **Collagen represents 90% of cervical volume**

## CERVICAL CANCER

Mortality rate per 100,000, female

- 17.5+
- 9.8-17.5
- 5.8-9.8
- 2.4-5.8
- <2.4
- No Data

- Major health problem: one of the most common female cancers in the world with 275 000 deaths per year, mainly in low-resource countries
- Slow evolution (10 - 20 years): ideal case for screening
- Direct access to cancer
- Model for other epithelial cancers

## Cervical cancer starts with infection by Human Papilloma Virus (HPV)

HPV

Evolution of cervical cancer

CIN I, CIN II, CIN III, Invasive cancer

- Detecting lesions at an early stage allows recovery in about 95% of cases with minor surgery
- Detecting these lesions with conventional optical techniques remains a major challenge

CIN = Cervical Intraepithelial Neoplasia

## Colposcopy

Colposcopy: low magnification microscope

Guiding conization

Colposcopy: ineffective and costly technique (low sensitivity and specificity for the detection of precancerous lesions)

Objective: improve colposcopy using Mueller polarimetric imaging

## Mueller polarimetry

Stokes vector  
 Four-component intensity vector

$$S = \begin{bmatrix} S_0 \\ S_1 \\ S_2 \\ S_3 \end{bmatrix} = \begin{bmatrix} I \\ I_x - I_y \\ I_{45^\circ} - I_{-45^\circ} \\ I_L - I_R \end{bmatrix}$$

Mueller matrix  
 16-component real matrix

$$S' = MS$$

$$M = \begin{bmatrix} m_{11} & m_{12} & m_{13} & m_{14} \\ m_{21} & m_{22} & m_{23} & m_{24} \\ m_{31} & m_{32} & m_{33} & m_{34} \\ m_{41} & m_{42} & m_{43} & m_{44} \end{bmatrix}$$

$M \in \mathbb{R}^{4 \times 4}$

Comprehensive polarimetric description of a target

## Tissue polarimetric parameters

**Depolarization ( $M_{11}$ )**

Depolarization quantifies the ability of a target to reduce the degree of polarization of light.

**Stochastic process** (multiple scattering)

**Biological origin:** organelles, cytoplasm, ...

**Retardance ( $M_{12}$ )**

Phase difference between two polarization eigenstates

**Birefringence:** the refractive index varies with polarization

**Biological origin:** collagen, elastin, muscle fibers, ...

**Diattenuation ( $M_{13}$ )**

Difference in attenuation between two polarization eigenstates

**Absorption anisotropy:** The absorption coefficient varies with polarization

$M = M_D M_R M_A$

Lu-Chipman Decomposition to separate the main polarimetric effects

## Ex vivo polarimetric images of cervical specimens

Mueller matrix of a conization specimen at 550nm

- Non-diagonal matrix
- Mueller matrix decompositions to extract the main polarimetric parameters

Mueller polarimetric mesoscope  
 Field of view 4x4 cm<sup>2</sup>  
 450 - 700 nm  
 Spatial resolution: 120 μm/pixel

Multi-spectral approach for exploring tissue at different depths

Conization specimen

Conventional intensity image of cervical conization

Retardance (550nm) / Depolarization (550nm)

Lu-Chipman Decomposition

Precancerous lesions modify the structure of collagen beneath the epithelium

Ex vivo statistical analysis

	450 nm	550 nm	600 nm
All pixels	Threshold : -10.1° Se: 77.6% Sp: 77.1%	Threshold : -8.9° Se: 78.7% Sp: 78.8%	Threshold : -9.2° Se: 78.1% Sp: 77.8%
(Depol > 0.65)	Threshold : -10.6° Se: 83.8% Sp: 83.6%	Threshold : -9.7° Se: 81.7% Sp: 80.9%	Threshold : -9.8° Se: 79.7% Sp: 79.2%

Statistical analysis on 83 specimens

- >90% sensitivity and specificity using retardance at 550 nm alone to discriminate CIN3 from healthy squamous epithelium
- ~90% sensitivity and specificity by combining Retardance and Depolarization at different wavelengths using deep learning algorithms

## Mueller polarimetric colposcopy

No mechanical movements  
 Wavelengths: 460, 530 and 630 nm  
 2 additional wavelengths at 650 and 700 nm  
 64 images in 1 s  
 Field of view: 4x4 cm<sup>2</sup>  
 Spatial resolution: 50 μm/pixel

~10 patients analyzed

« OFF » Without dye / Acetic acid / Lugol

« ON » 550nm / 650nm / 700nm

The results obtained in vivo are consistent with those previously observed ex vivo

Conventional colposcopy vs Mueller polarimetric colposcopy

Mueller polarimetric imaging is very promising to improve the detection of precancerous lesions

A model to accurately characterize healthy cervical tissue is needed to establish a baseline

- The clinical study (COLPOTERME) is conducted at Kremlin Bicêtre University Hospital to probe cervical microstructure for improved prematurity prediction
- The cervix of pregnant women provides a unique in vivo model to characterize metaplastic transformations
- ~400 women analyzed to map multiple anisotropy and scattering cervical properties involved in these transformations
- Input: RGB + polarimetric features (multimodal)

Semantic segmentation of 4 epithelial classes: Columnar Epithelium (CE), Mid Metaplastic Epithelium (MME), Late Metaplastic Epithelium (LME), Stratified Squamous Epithelium (SSE) + background (BG)

## Clinical trial

- Polarimetric analysis of the cervix for a large cohort of patients in vivo
- Accurate comparison between polarimetric images and biopsy results

200 patients to analyze

On average 2 biopsies per patient for a total of about 400 biopsies

1. J. Park Digital multispectral Mueller colposcopy for exploring cervical microstructure in vivo, 2022 (PhD Thesis).  
 2. A. Pierangelo, et al. "Mueller polarimetric imaging for cervical intraepithelial neoplasia detection" In: Polarized Light in Biomedical Imaging and Sensing. Springer, Cham. doi: 10.1007/978-3-031-04741-1\_6 (2023).