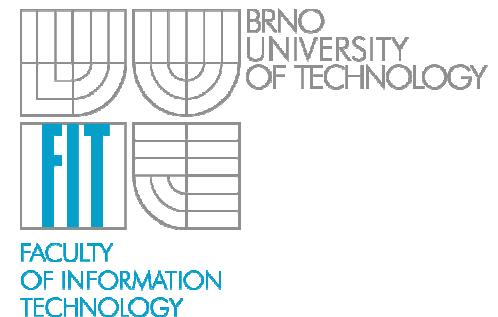


# Fingerprint Recognition Technology: Liveness Detection, Image Quality and Skin Diseases

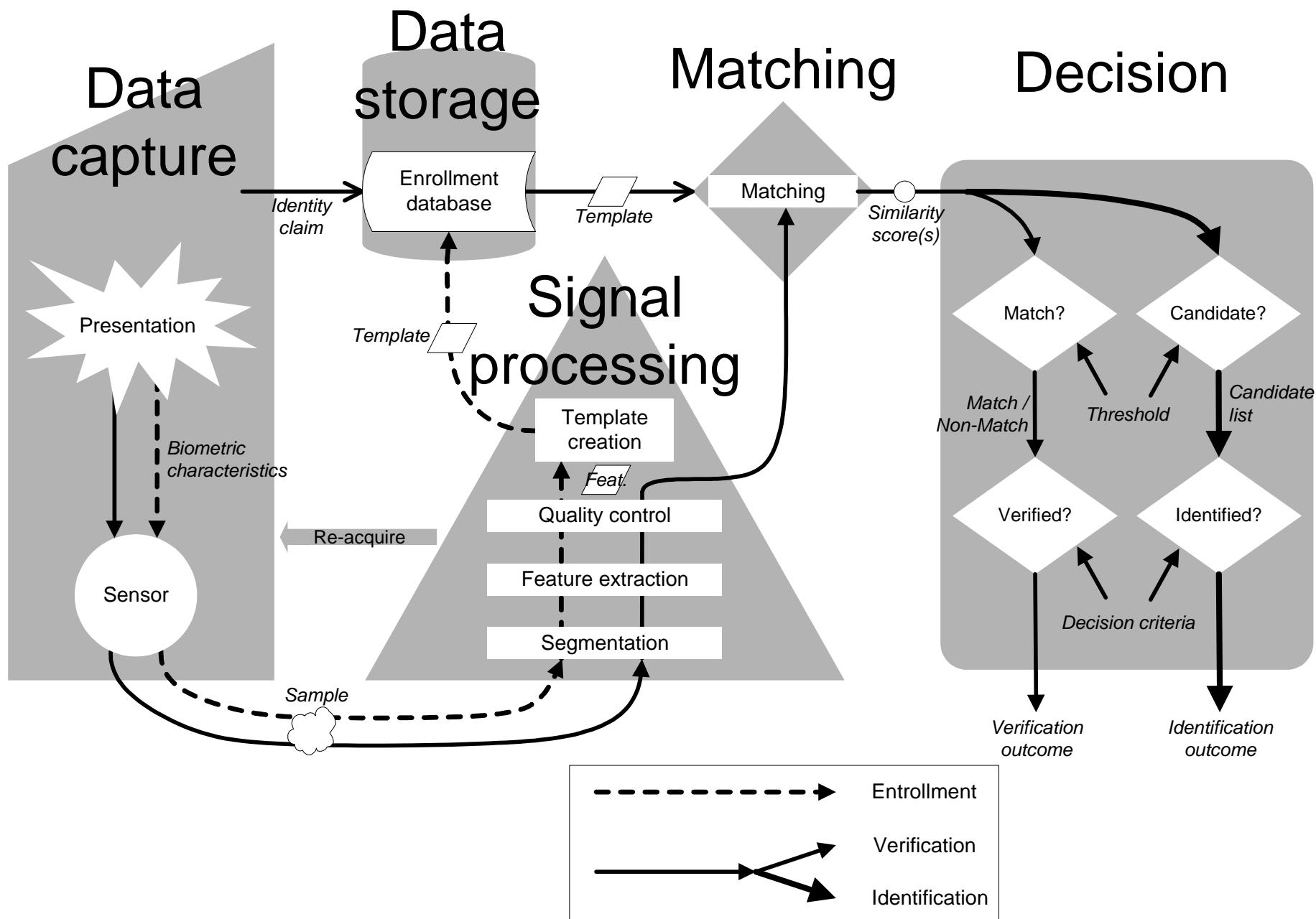
Martin Drahanský

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Božetěchova 2, 612 66 Brno, Czech Republic  
<http://www.fit.vutbr.cz/~drahan> | [strade.fit.vutbr.cz](http://strade.fit.vutbr.cz)  
[drahan@fit.vutbr.cz](mailto:drahan@fit.vutbr.cz)



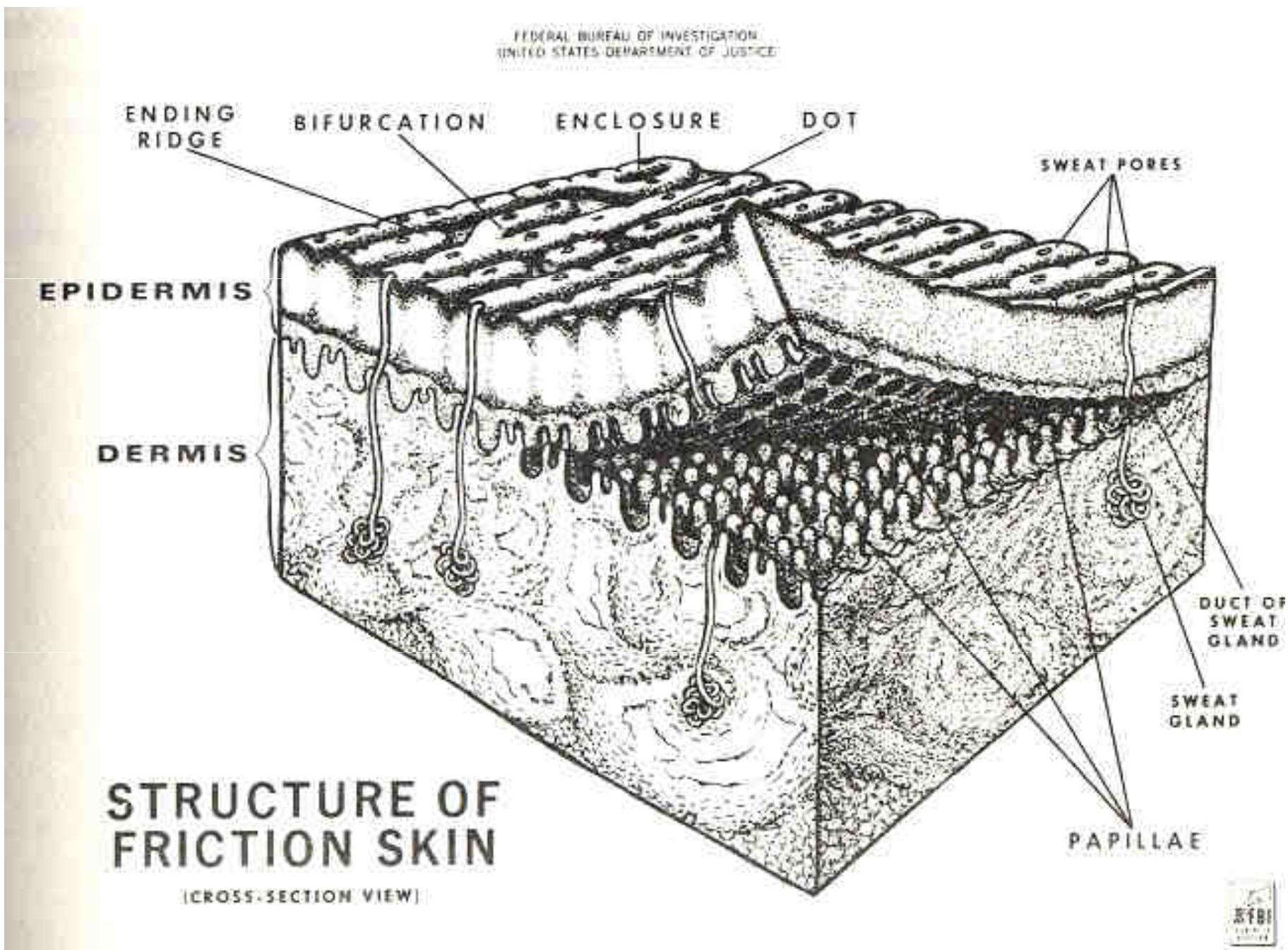
# Introduction

# General biometric system



# Skin structure on fingers

FBI



# Technologies of fingerprint sensors



## Optical Technology



## Capacitive Technology



## Ultrasound Technology



## E-Field Technology



## Electrooptical Technology



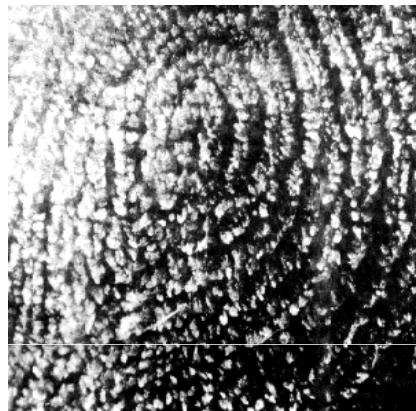
## Pressure Sensitive Technology



## Thermal Technology



# I Other problems at sensorics



Bergdata FCAT-100



Veridicom 5<sup>th</sup> Sense

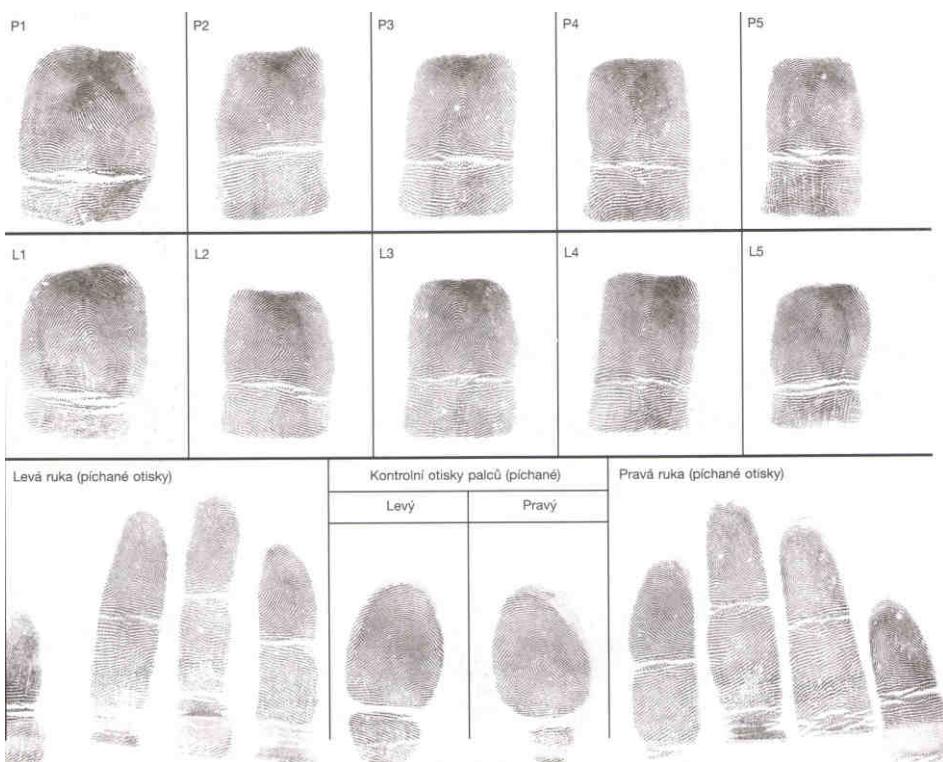


Earth dust

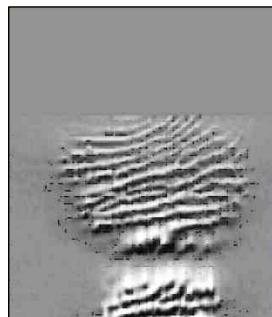
Metallic dust

Fine sand

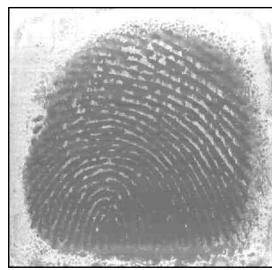
Oiled finger



Bergdata FCAT-100



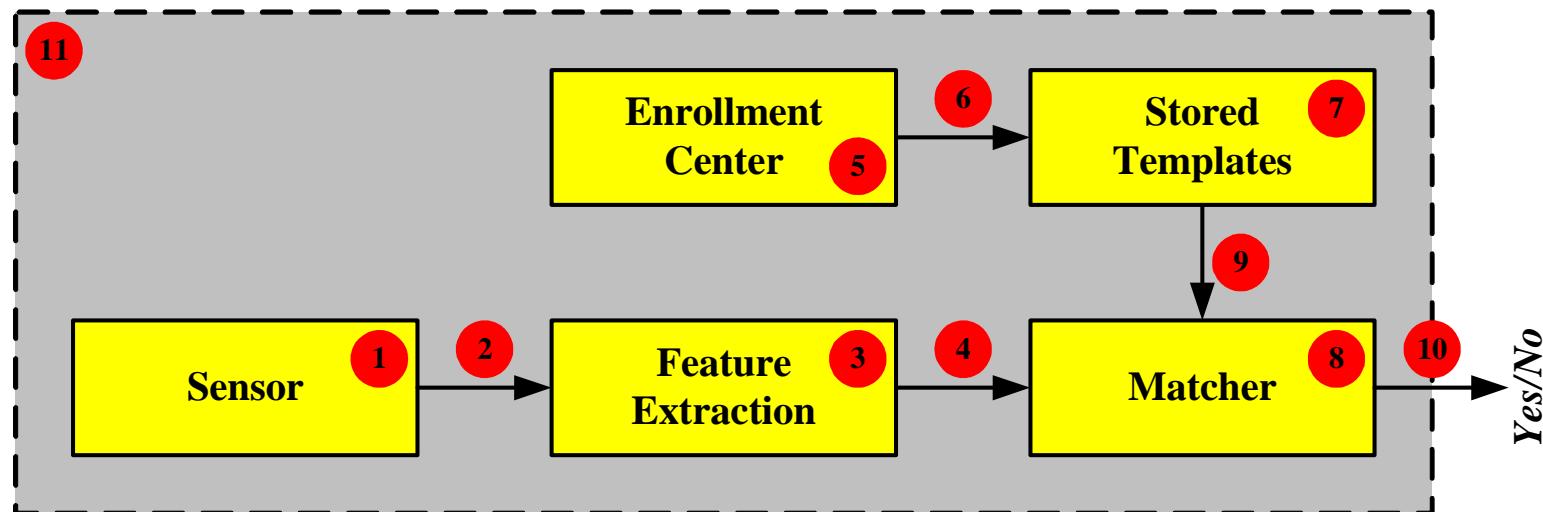
Veridicom 5<sup>th</sup> Sense



About -10°C

About +50°C

# Security of biometric systems



# Finger fakes



Suprema SFM 3020  
(fake – rubber stamp)



Artificial fingerprints (SFinGe)

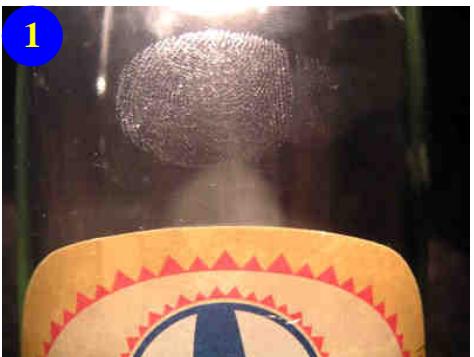


Artificial fingers



Fake fingerprints of different materials

# How to produce a fake finger(print)?



Play video

# Liveness detection

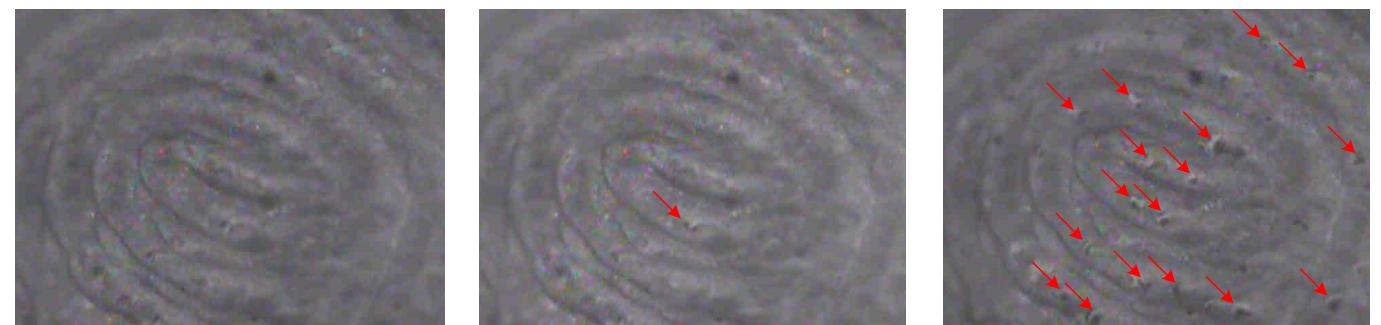
# Perspiration



- Clarkson/Virginia universities
- 600 sweat glands in 1 inch<sup>2</sup>
- Duration approx. 5 seconds
- High intra-class variability



*Time*

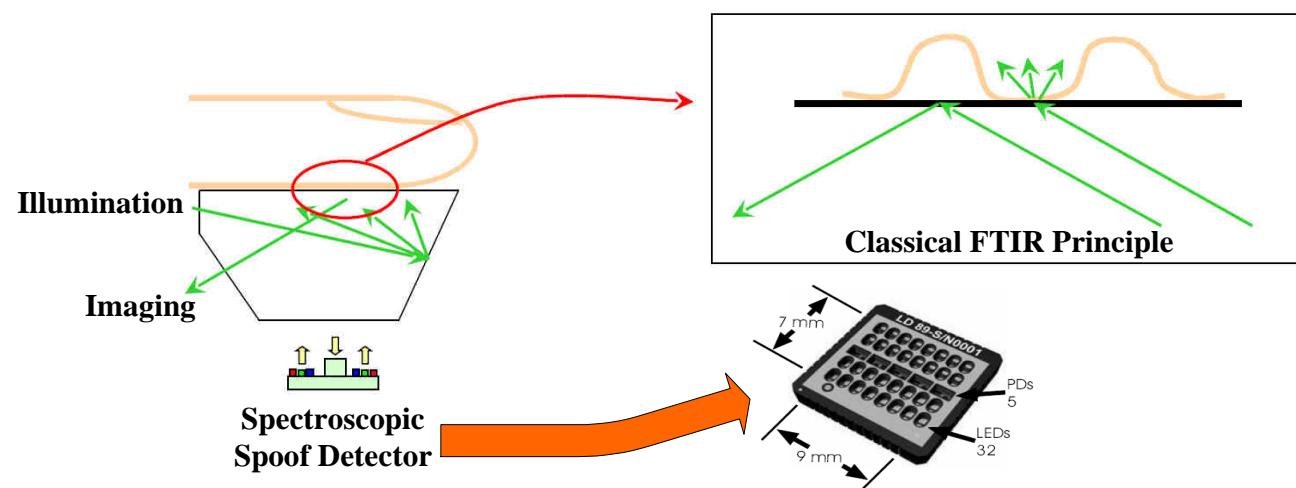
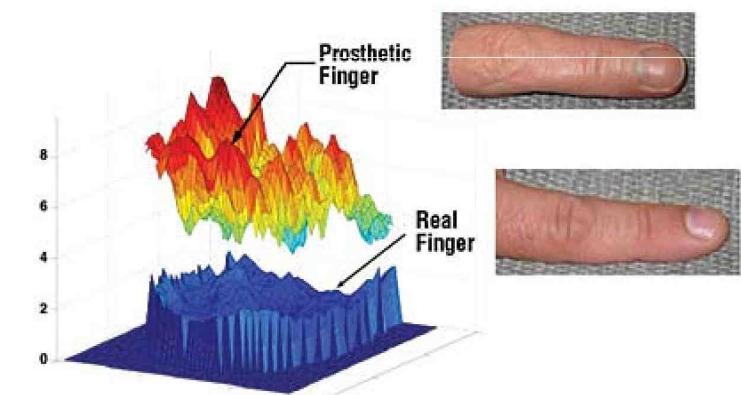
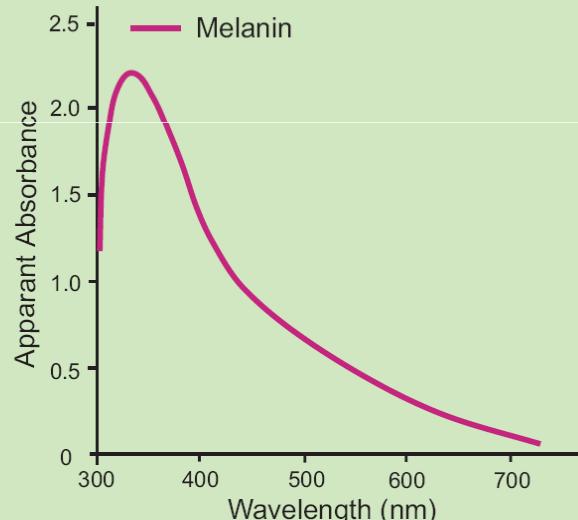
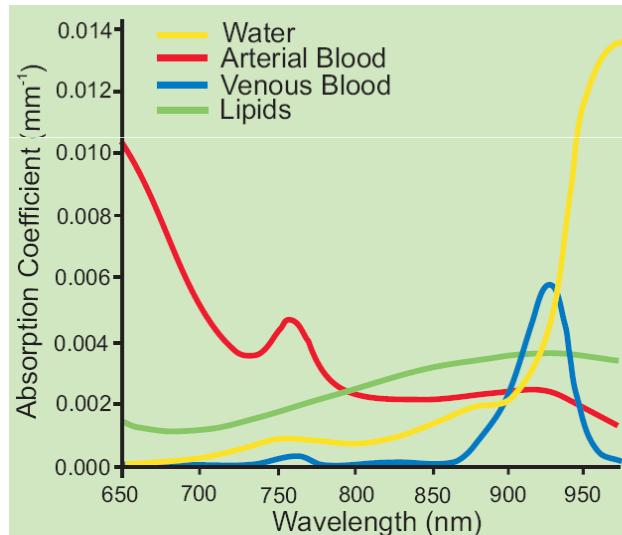


*Time*

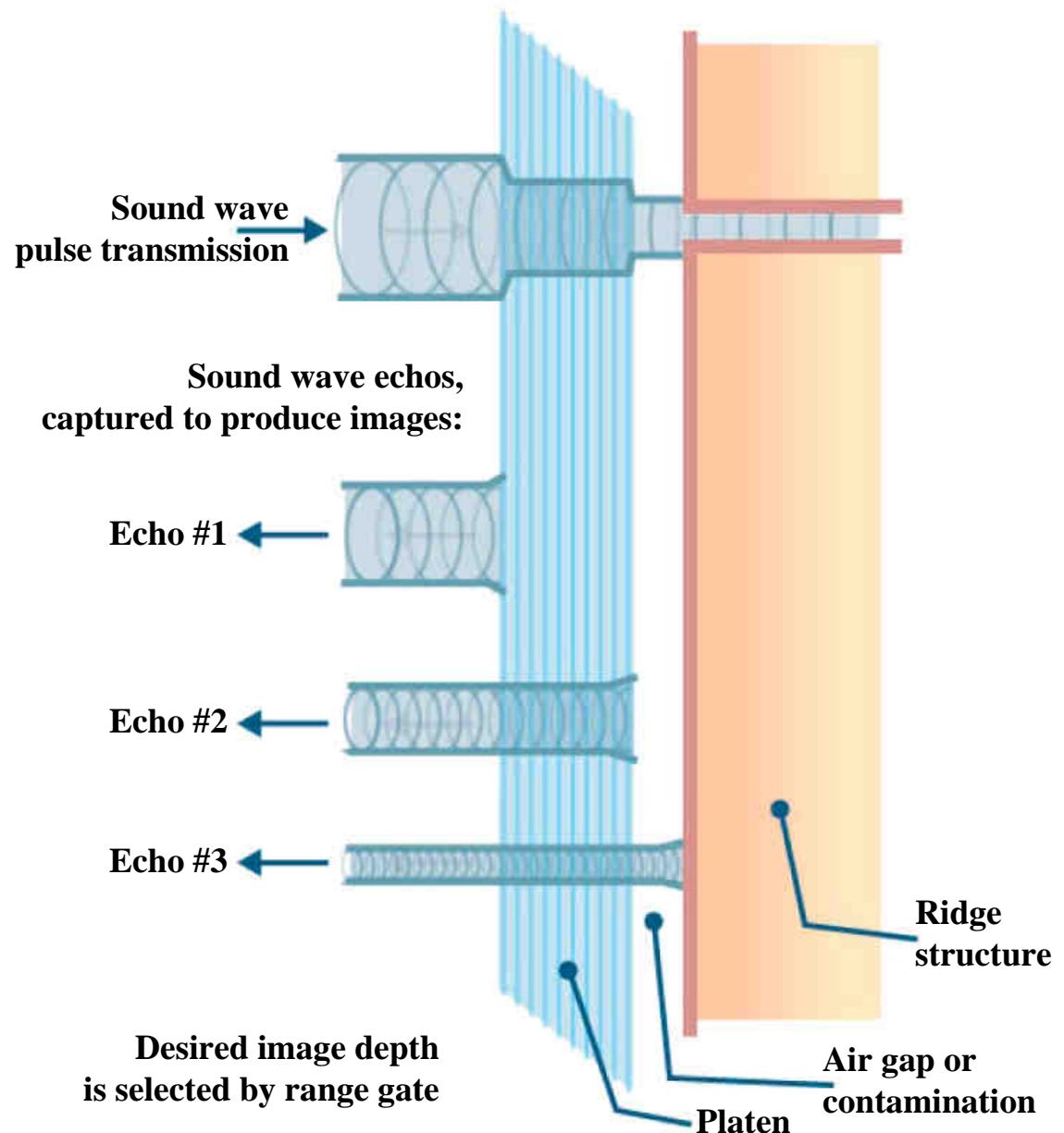
# Spectroscopic characteristics



- Lumidigm Ltd.(Albuquerque)
  - Clones: TST Biometrics GmbH, Sagem Morpho etc.



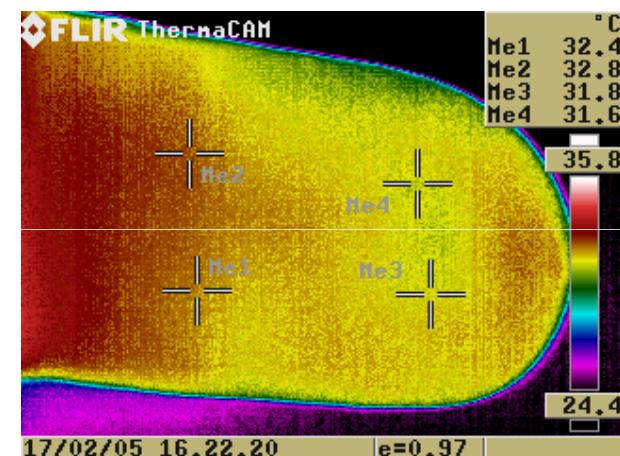
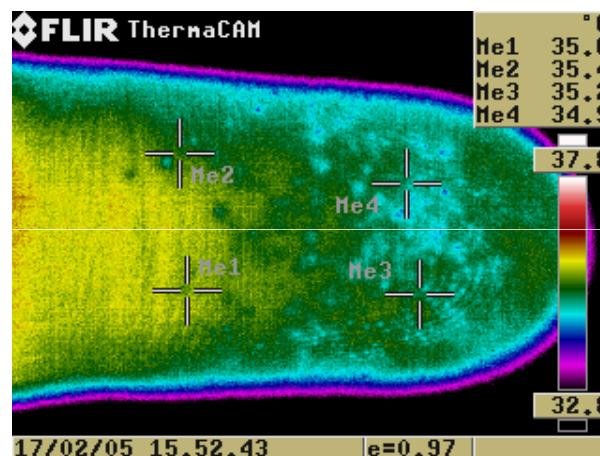
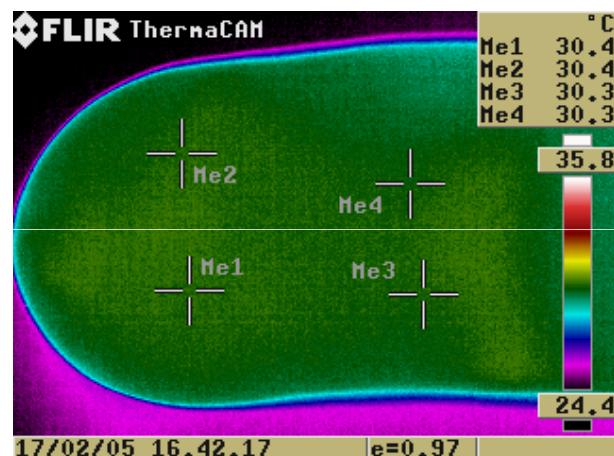
- Ultra-Scan / Optel



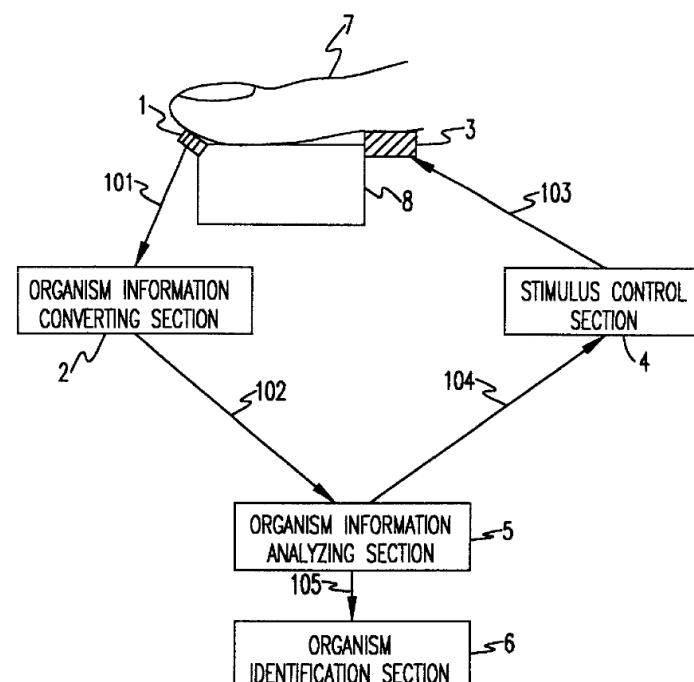
# Temperature + Hot & cold stimulus

FIT

- Temperature

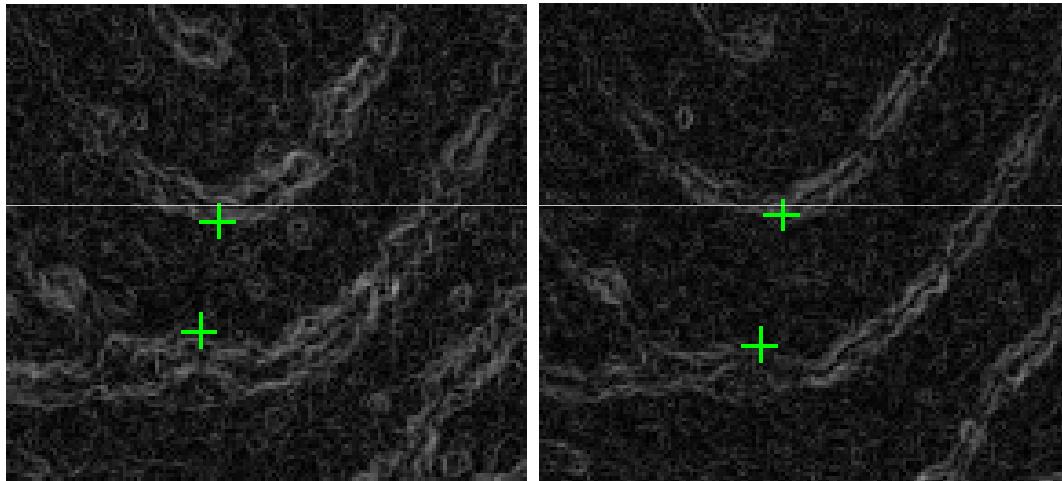


- Hot and cold stimulus



- National utility model ÚPV 19364

- Ridge elasticity
  - 20%



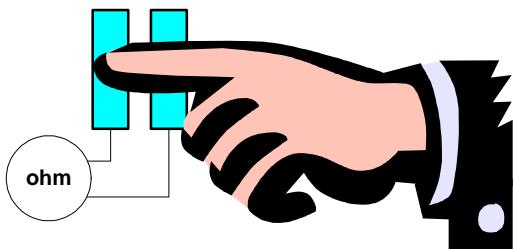
- Change of color (RGB)
  - G ~ 42



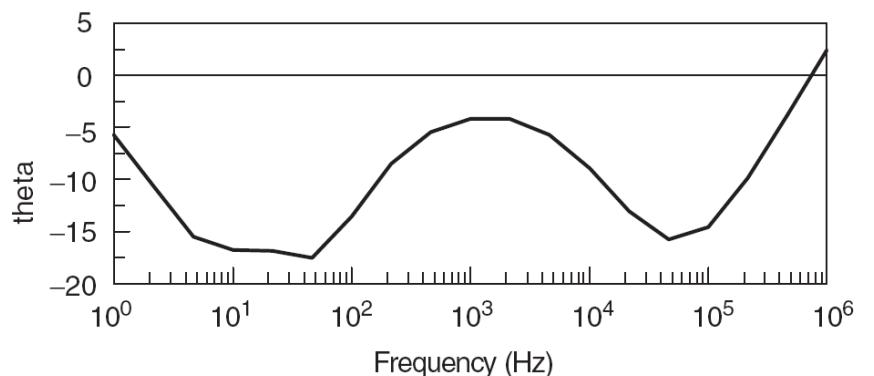
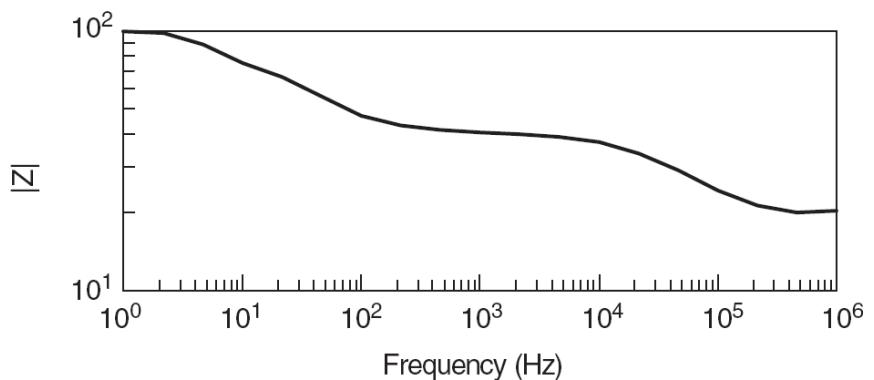
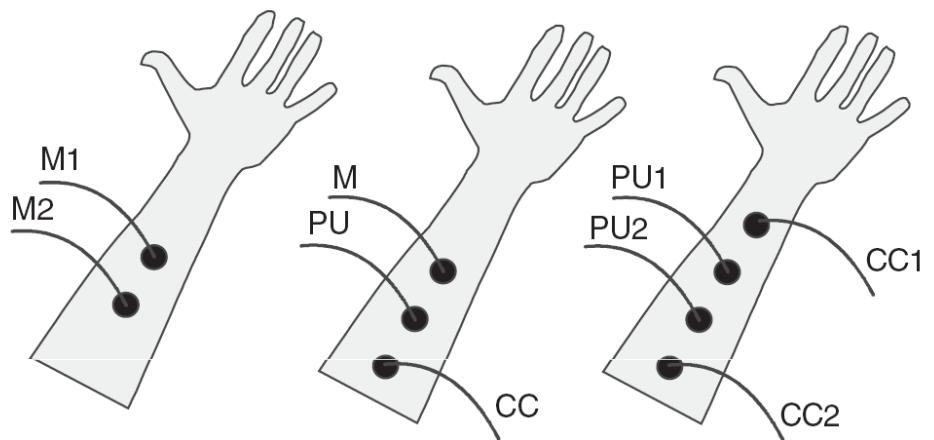
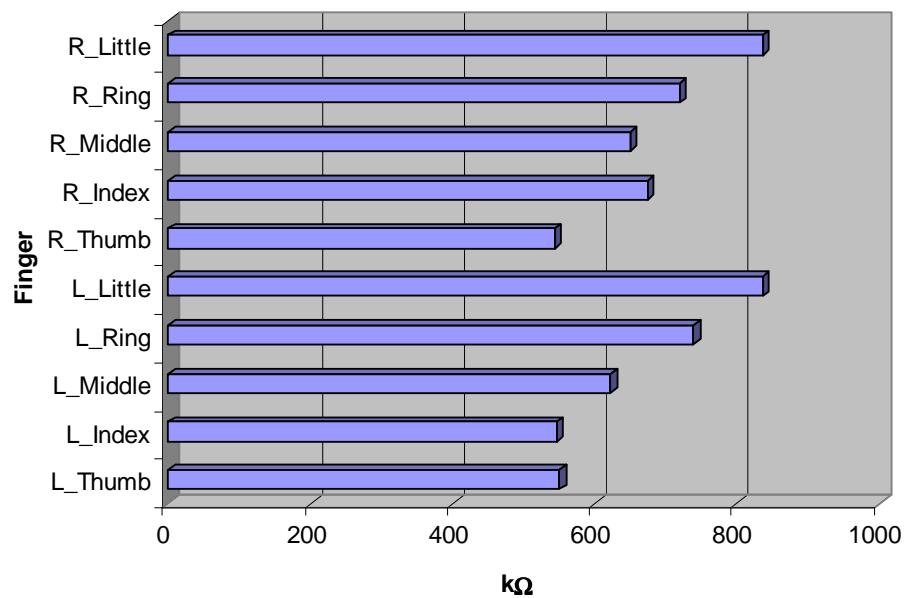
# Electrical properties



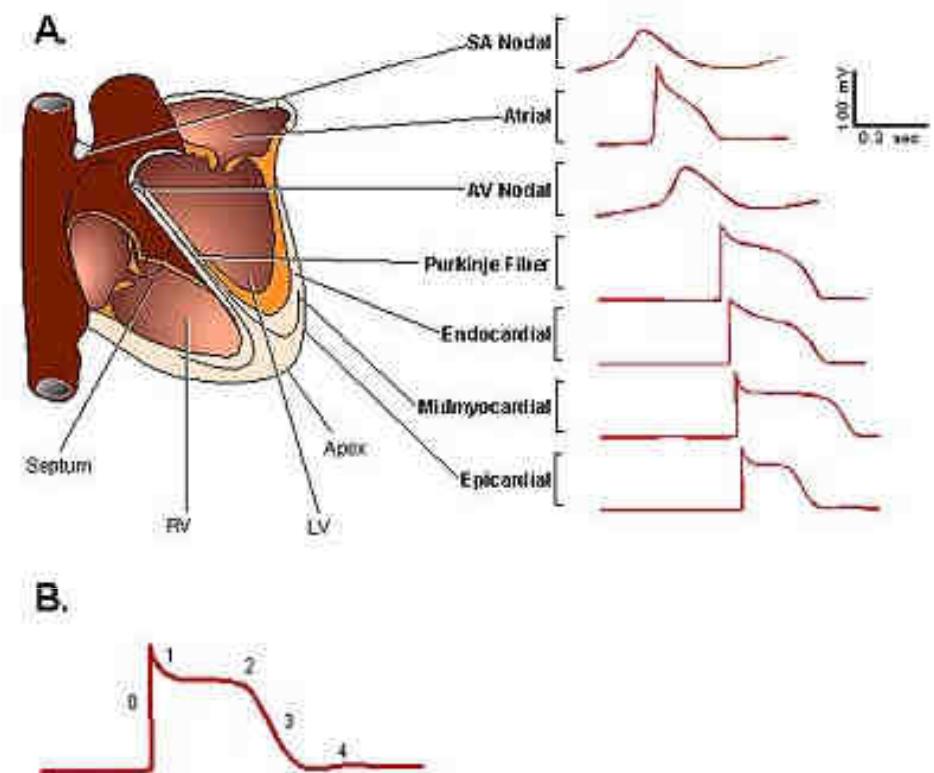
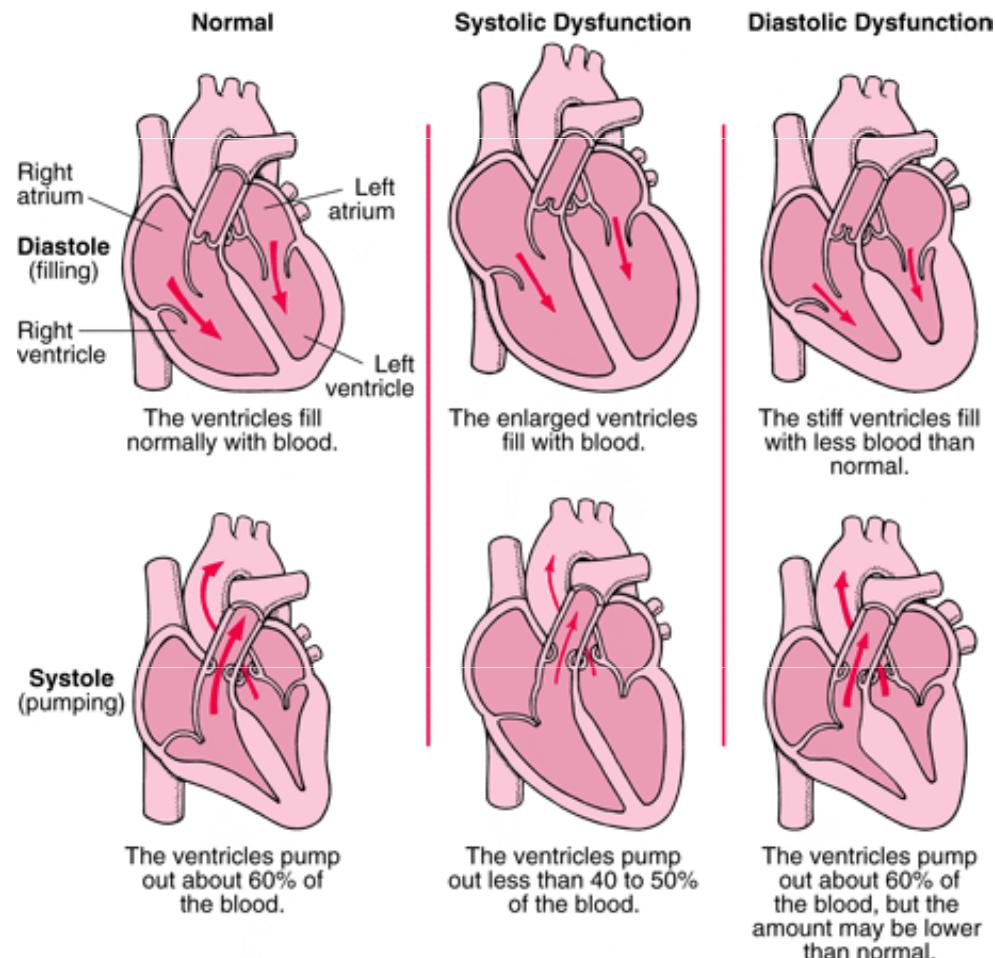
- Bio-impedance →
- Resistance / Conductivity



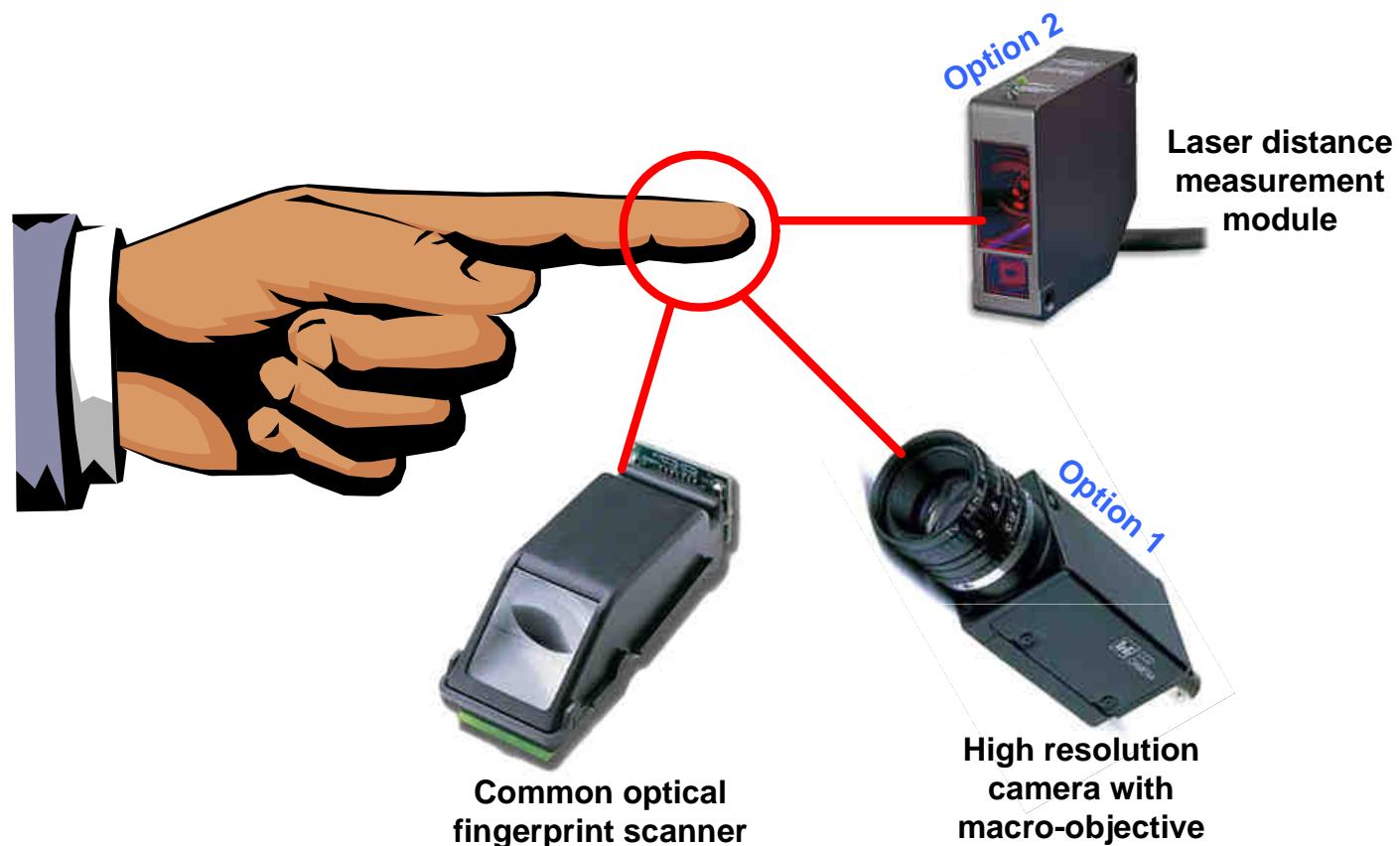
Measurement with DC low voltage



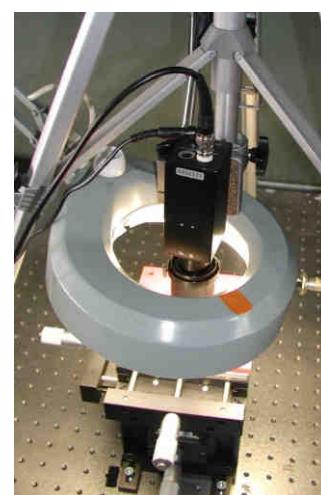
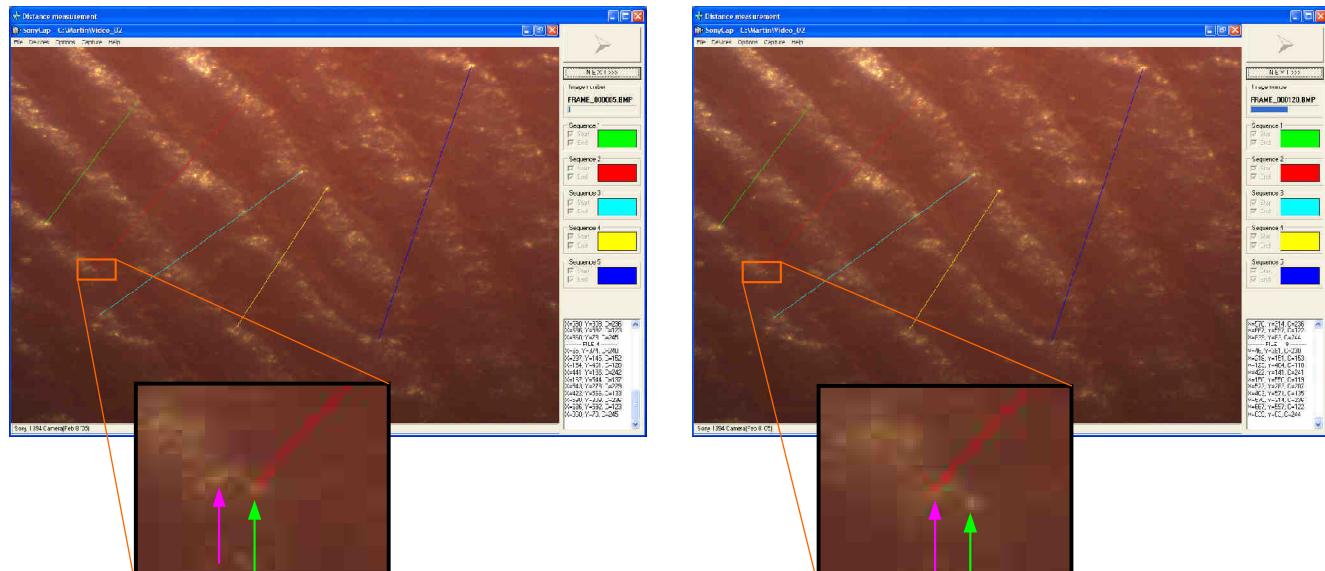
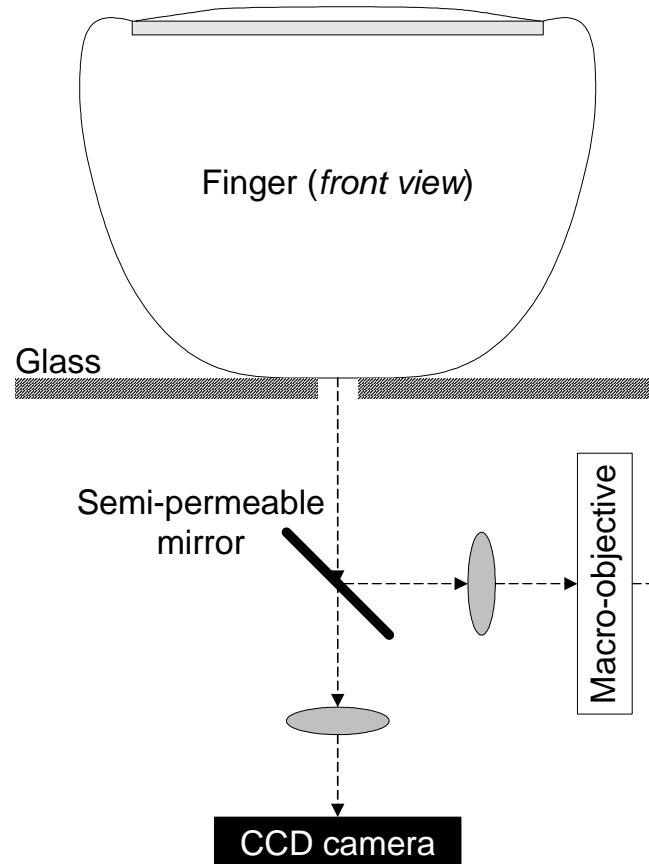
- Heart activity



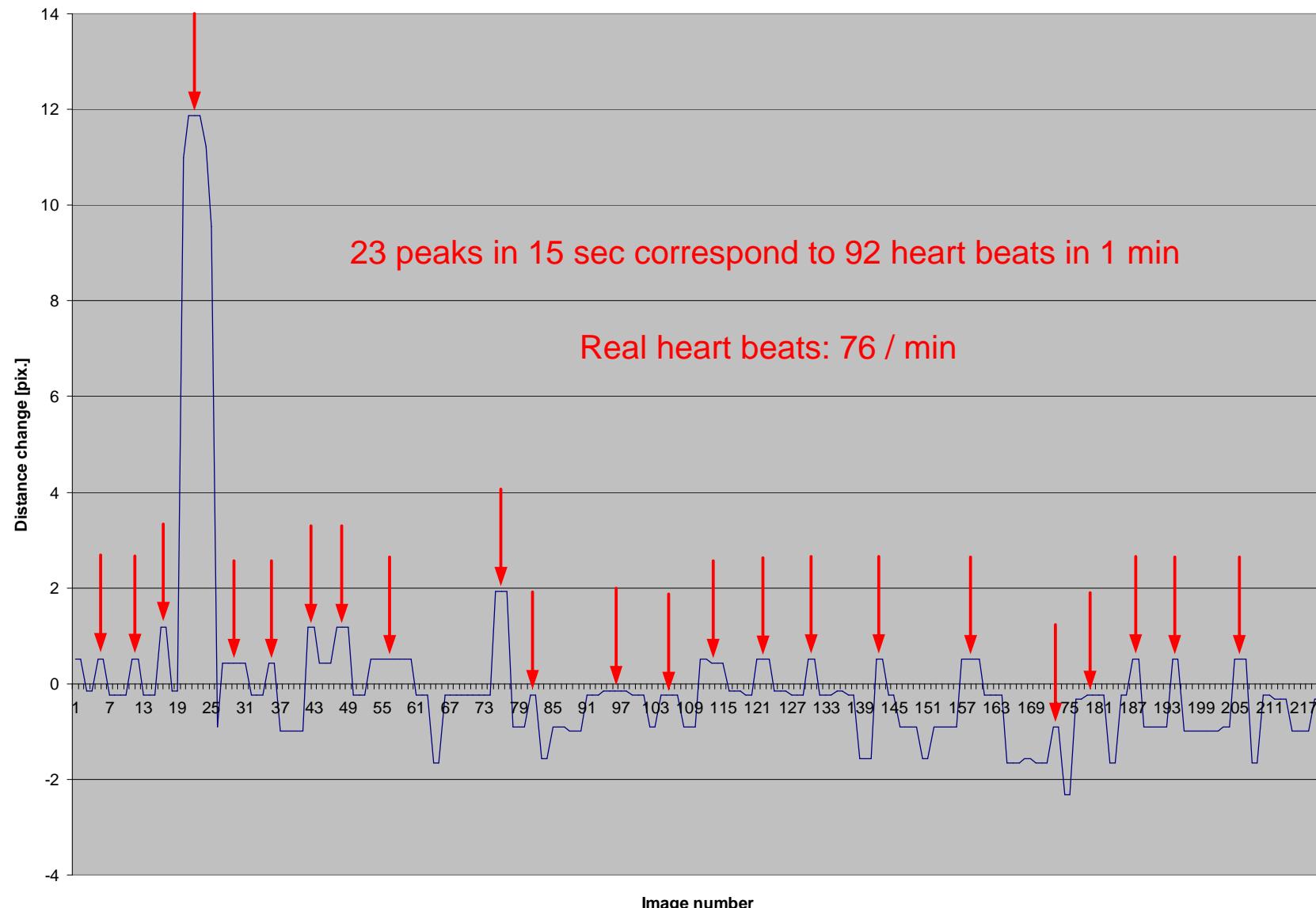
- International patent WO/2007/036370



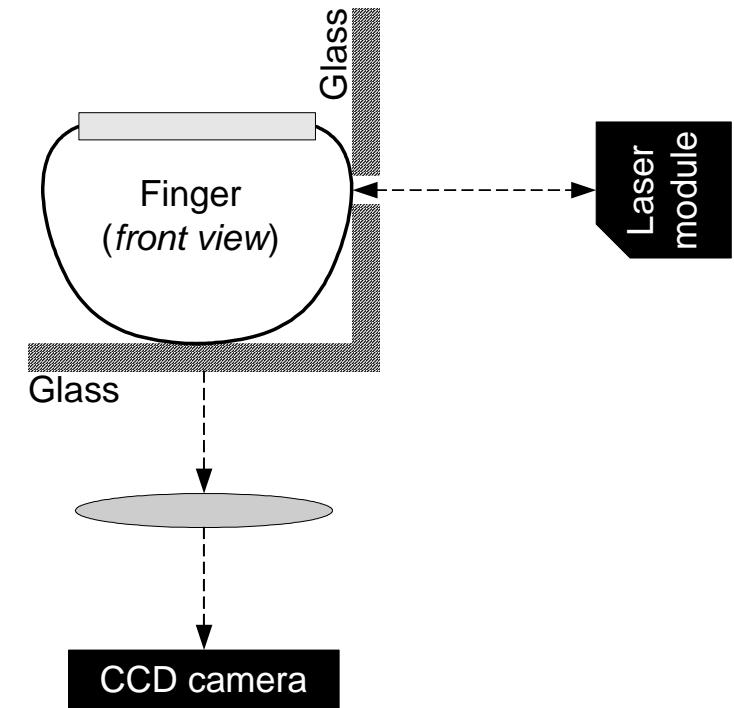
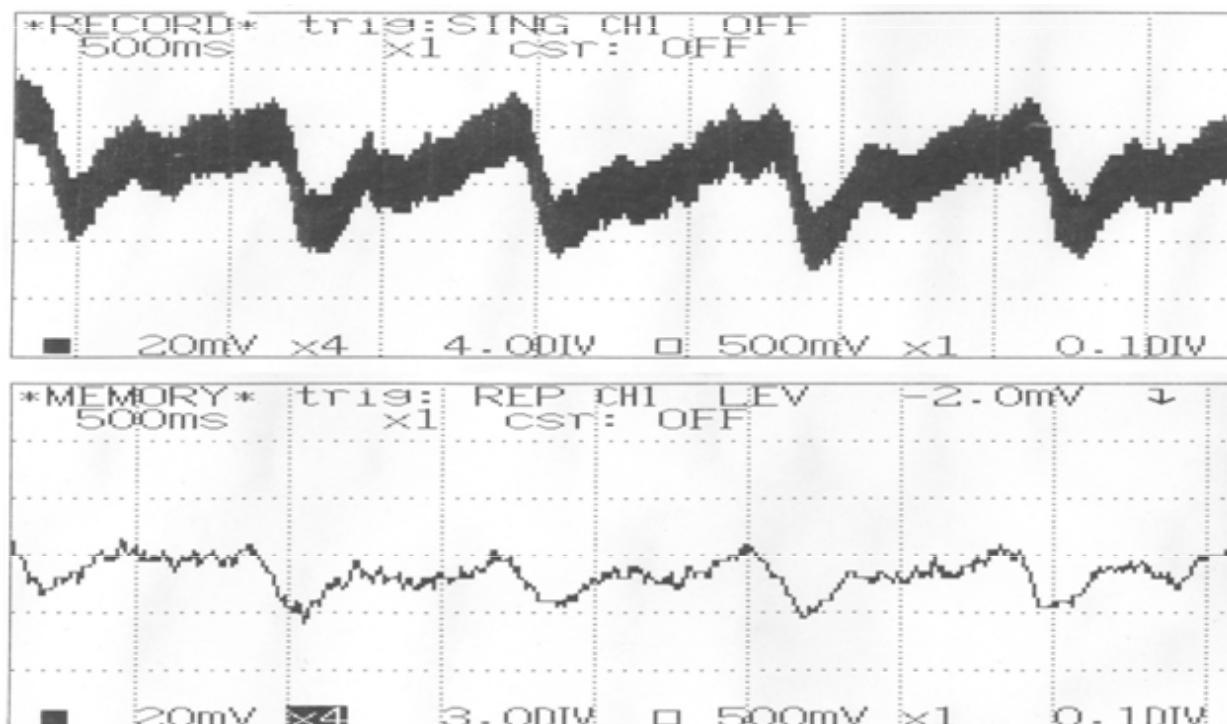
- Macroobjective I.



- Macroobjective II.

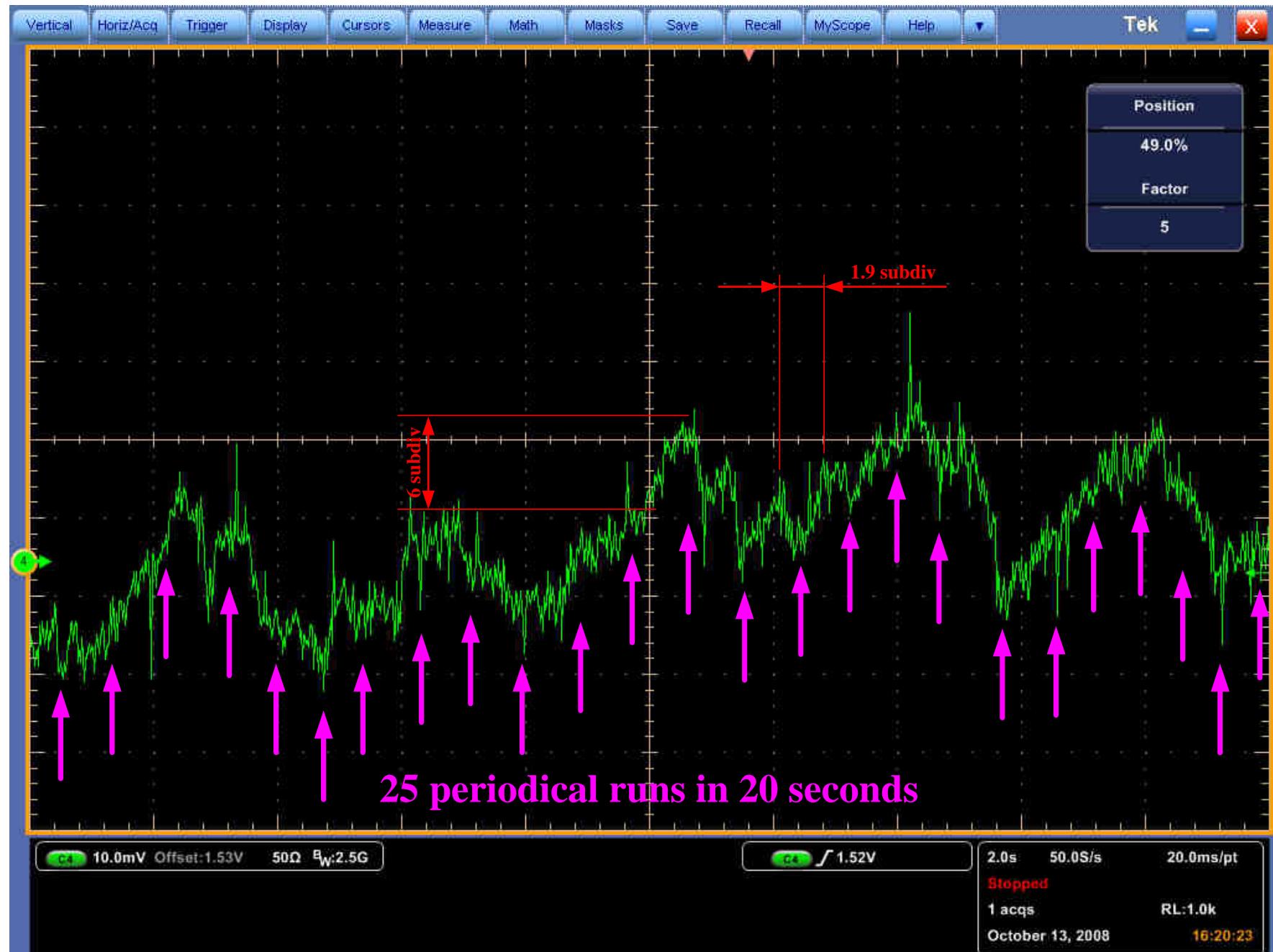


- Laser I.

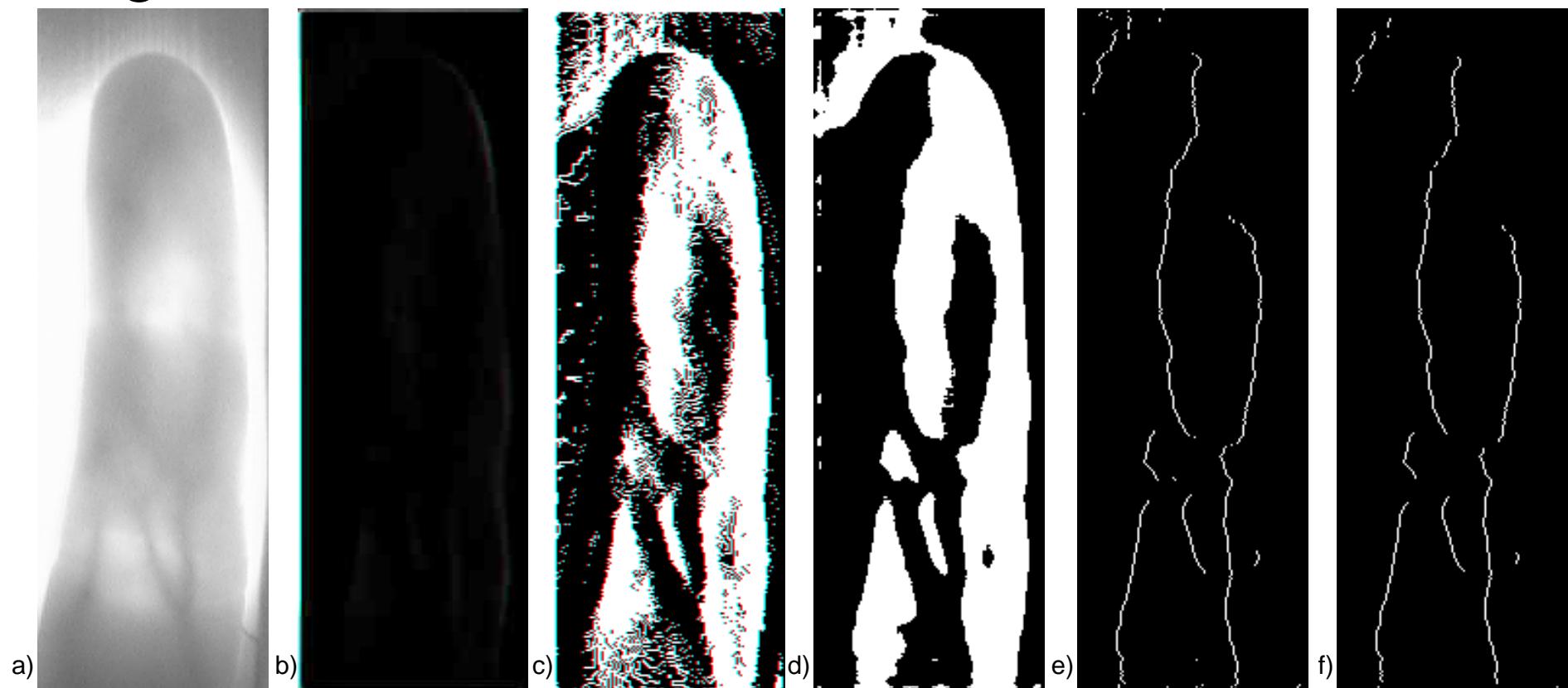


# Pulse VI.

IT



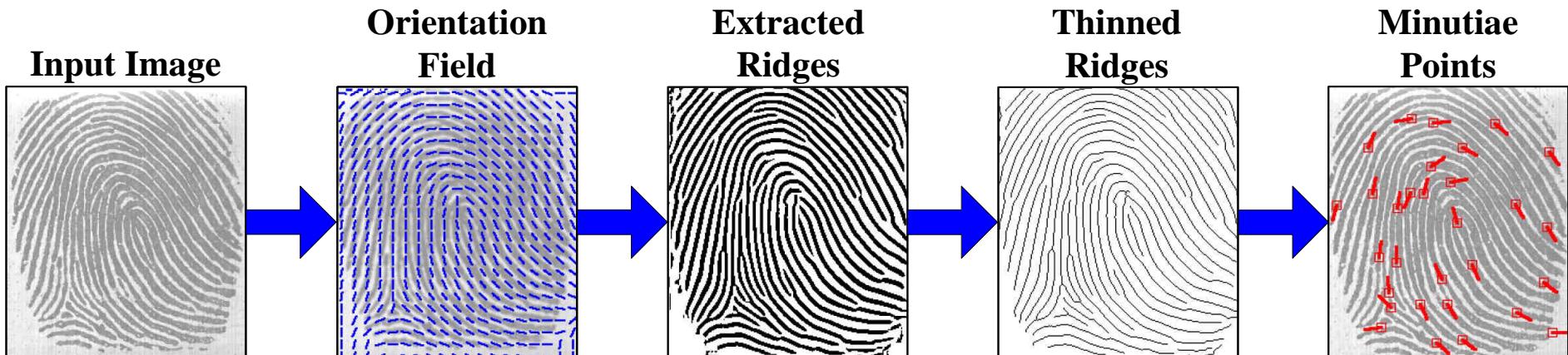
- Infrared illumination (660 nm / 940 nm)
- Reflection vs. transmission
- Finger veins



# Image quality

# Fingerprint recognition process

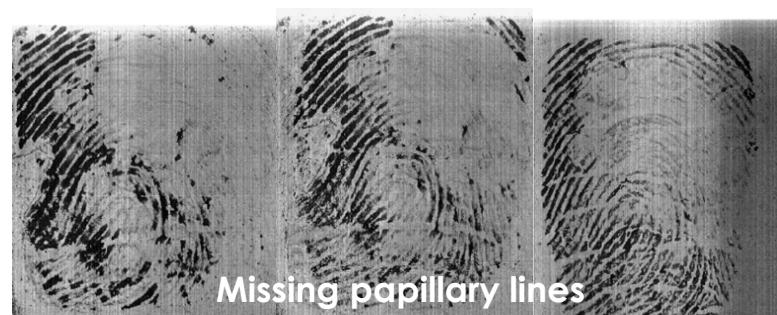
- Flowchart results of the minutiae extraction



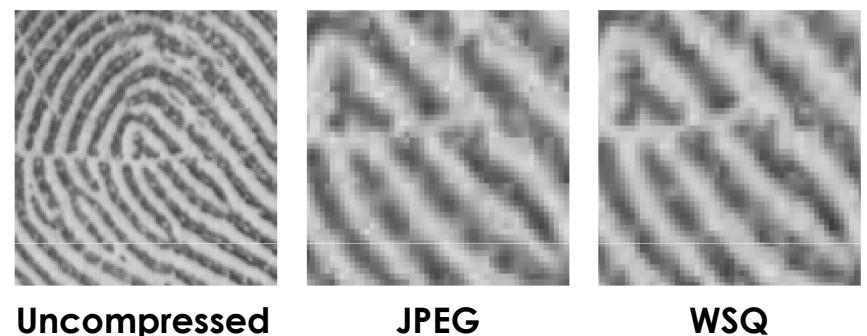
- Change of image quality



Contrast change



Missing papillary lines



Uncompressed

JPEG

WSQ

# Used sensors for tests of image quality

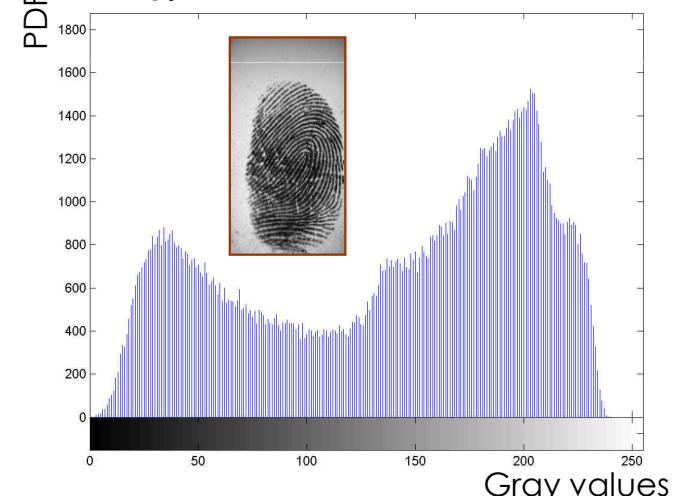
- Suprema Evaluation Development Kit SFM3xxx



<i>Model / Features</i>	<b>SFM3000</b>	<b>SFM3010</b>	<b>SFM3020</b>	<b>SFM3050</b>
<b>Sensor</b>	FingerLoc AF-S2 by AuthenTec	FingerChip by Atmel®	not known	TouchChip® TCS2 by UPEK
<b>Technology [Dra25]</b>	e-field	thermal, sweep	optical	capacitive
<b>Power supply</b>	3.3 V (DC)	3.3 V (DC)	3.3 V (DC)	3.3 V (DC)
<b>Take-off current</b>	100 – 300 mA	4.5 mA	not known	not known
<b>Resolution [DPI]</b>	250	500	500	500
<b>Sensor size [mm]</b>	13 × 13	11.6 × 0.4	16 × 19	10.4 × 14.4
<b>Module size [W×D×H] [mm]</b>	55 × 40 × 8	55 × 40 × 8	55 × 40 × 8	55 × 40 × 8
<b>Image size [pix.]</b>	128 × 128	360 × 500	272 × 320	256 × 360

- Michelson contrast  $C_{Michelson} = \frac{(L_{\max} - L_{\min})}{(L_{\max} + L_{\min})}$ 
  - $L_{\max}$  – intensity of foreground (papillary line/ridges)
  - $L_{\min}$  – intensity of background (valleys)
- Weber contrast  $C_{Weber} = \frac{\Delta L}{L}$ 
  - $\Delta L$  – intensity difference between foreground and background;  $L$  – intensity of background
- Fingerprint image histogram
  - $r_k$  –  $k^{\text{th}}$  gray grade value
  - $n_k$  – number of pixels in channel  $r_k$
  - $L$  – number of gray grades
  - $n$  – sum of pixels in the image

$$Hist(r_k) = \frac{n_k}{n}, k = 0, 1, 2, \dots, L-1$$



# Determination of contrast ratios



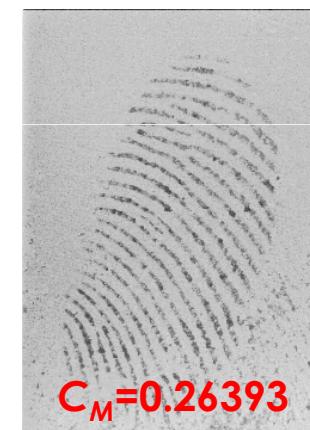
- Used Michelson contrast
  - Higher values (close to 1) are better results (SFM3000)



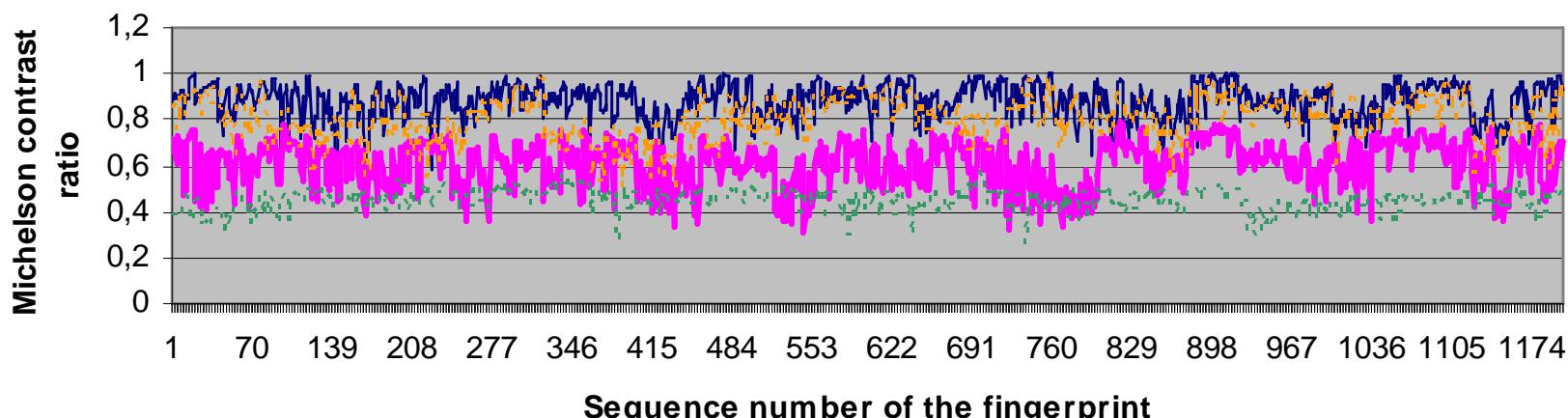
$$C_M = 0.98441$$



$$C_M = 0.58689$$



$$C_M = 0.26393$$



# Histogram normalization & Mean value

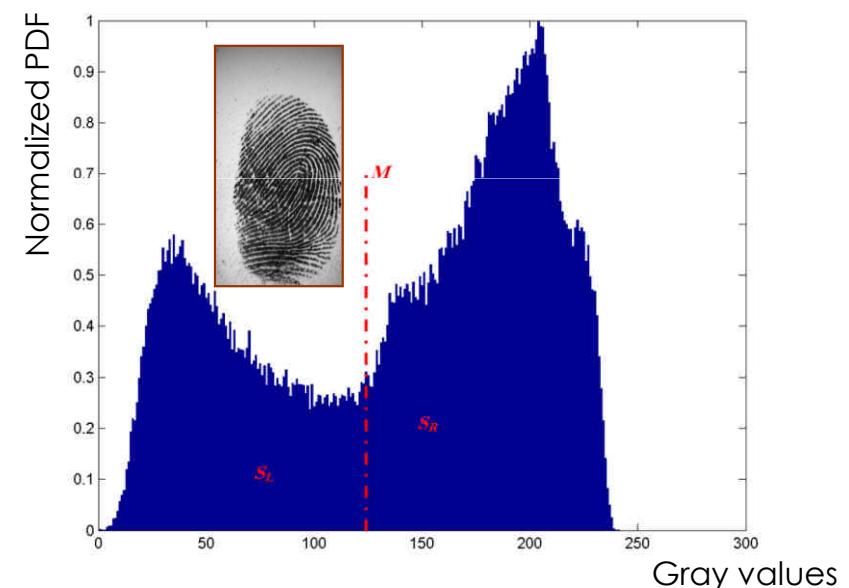
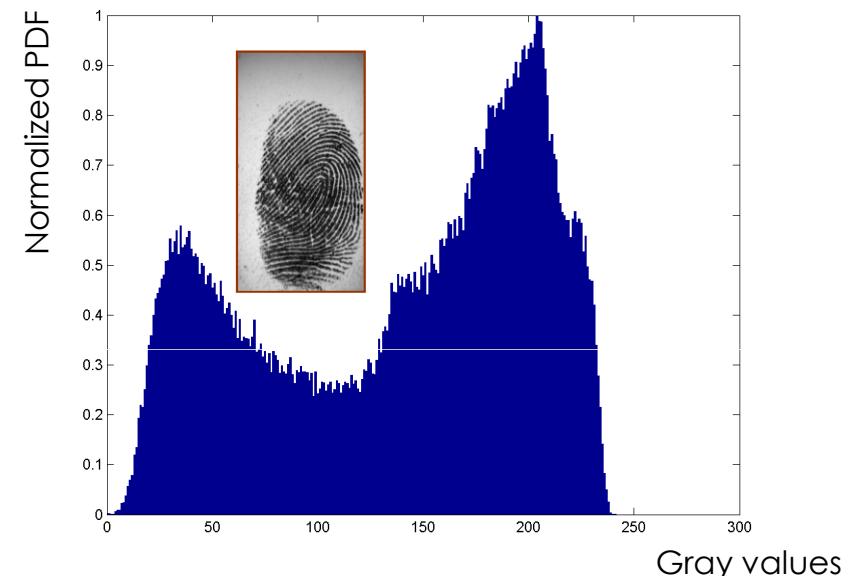
fit

- Histogram normalization
  - Probability distribution function in range  $<0;1>$

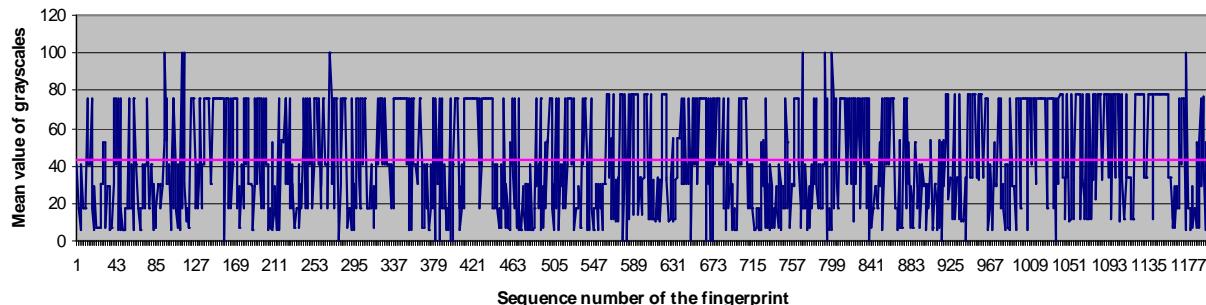
- Mean value
  - $S_L = \sum_{i=0}^{M-1} h_n(i)$        $S_R = \sum_{i=M}^{255} h_n(i)$
  - $M$  – mean value
  - Ideal case:  $M = 128$  ( $S_L \approx S_R$ )

- Theoretical  $M$ :  $M_T = \frac{B_{Dark} + B_{Light}}{2}$ 
  - $B_x$  – start & end of histogram

- Deviation  $D$ :  $D = \left| 1 - \frac{M_T}{M} \right| \cdot 100\%$

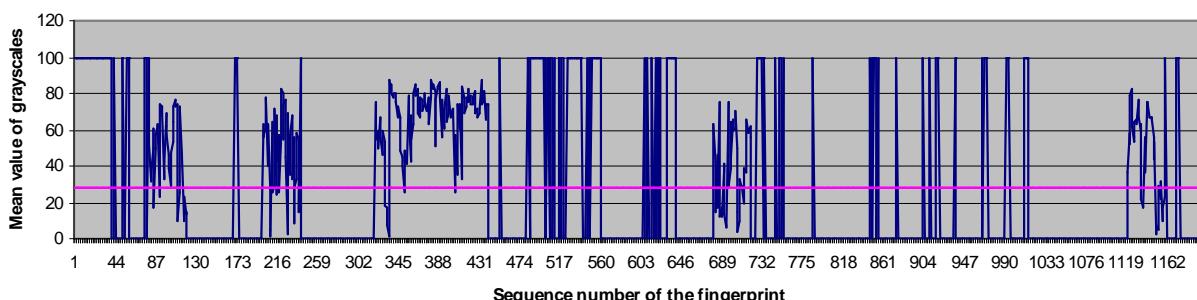
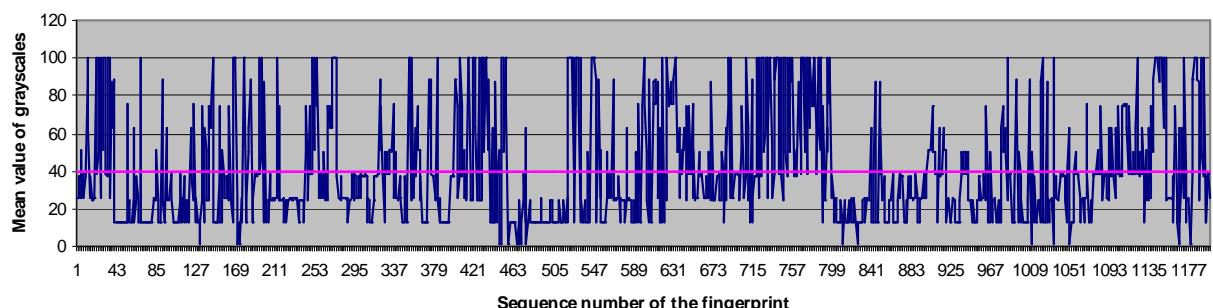


# Mean value of grayscale levels – deviation



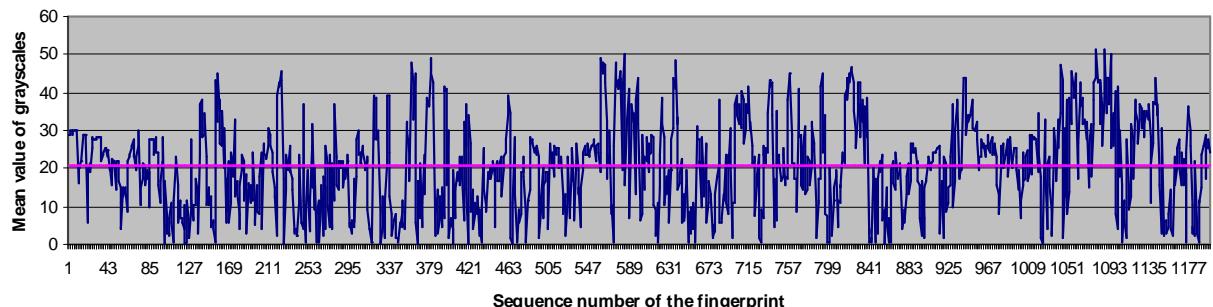
**SFM3000**, avg  $\approx 43\%$

**SFM3010**, avg  $\approx 40\%$



**SFM3020**, avg  $\approx 28\%$

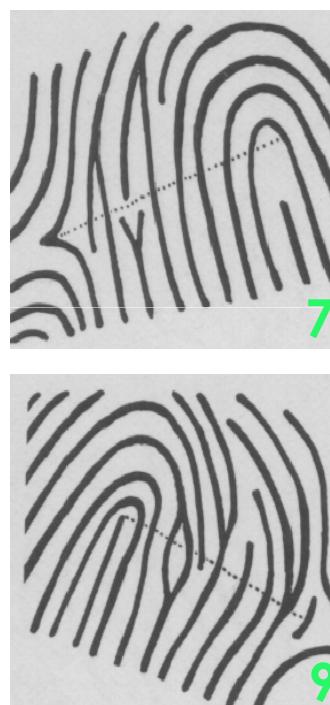
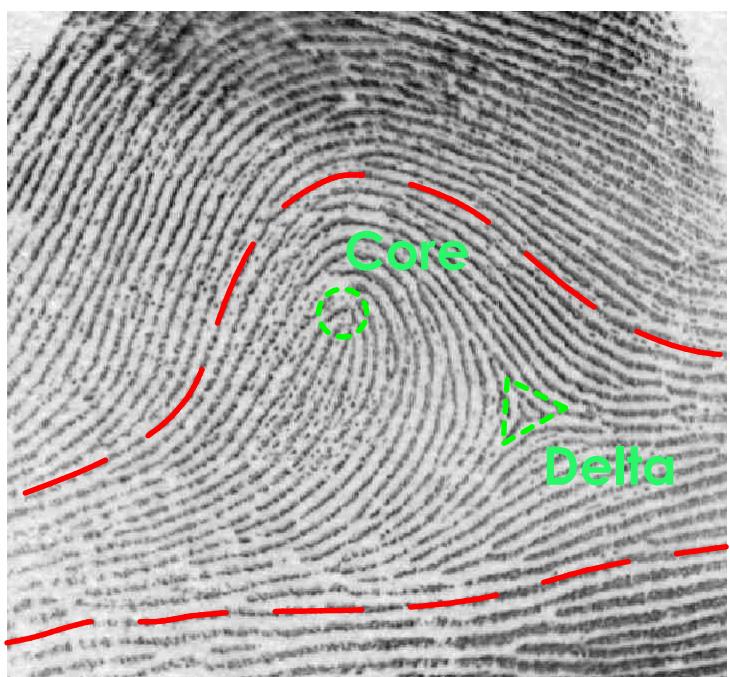
**SFM3050**, avg  $\approx 21\%$



# | Number of papillary lines



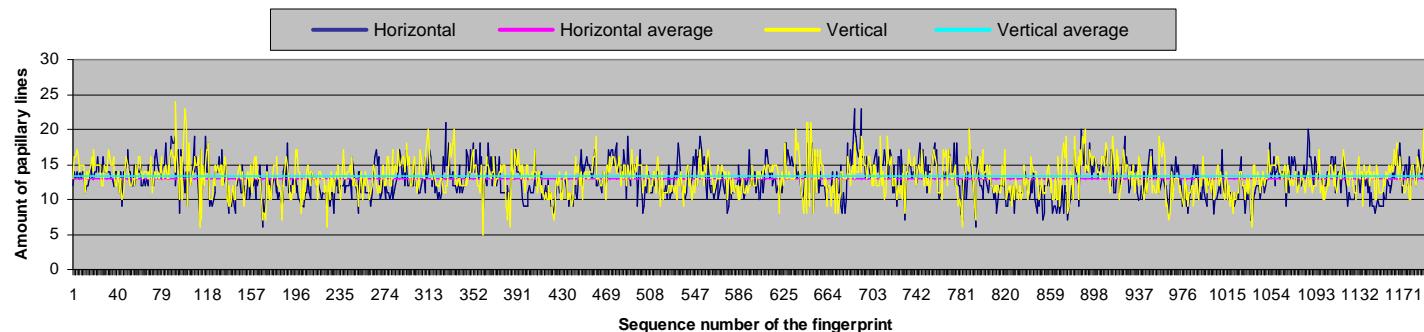
- In dactyloscopic literature defined as number of papillary lines between delta and core
- For estimation of fingerprint's center could be used horizontal and vertical values of papillary lines (comparison with homocentric circles)



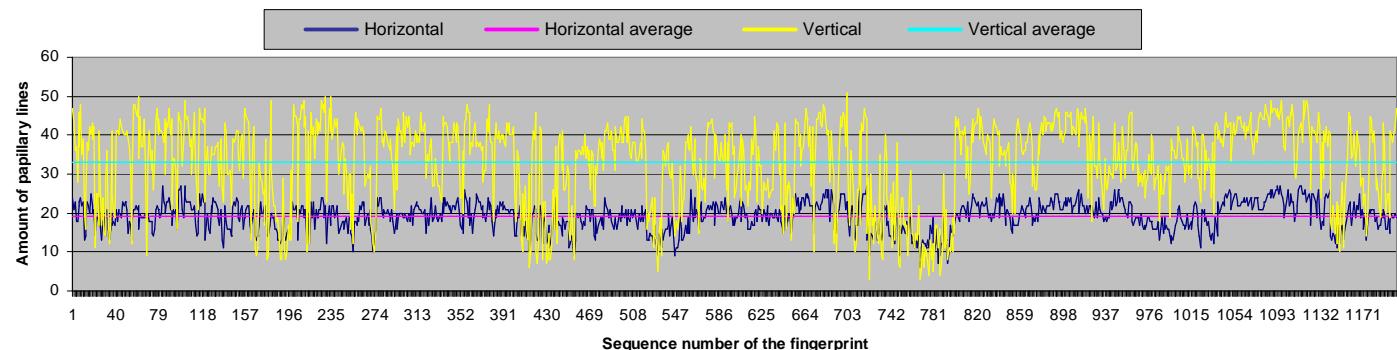
# Number of papillary lines



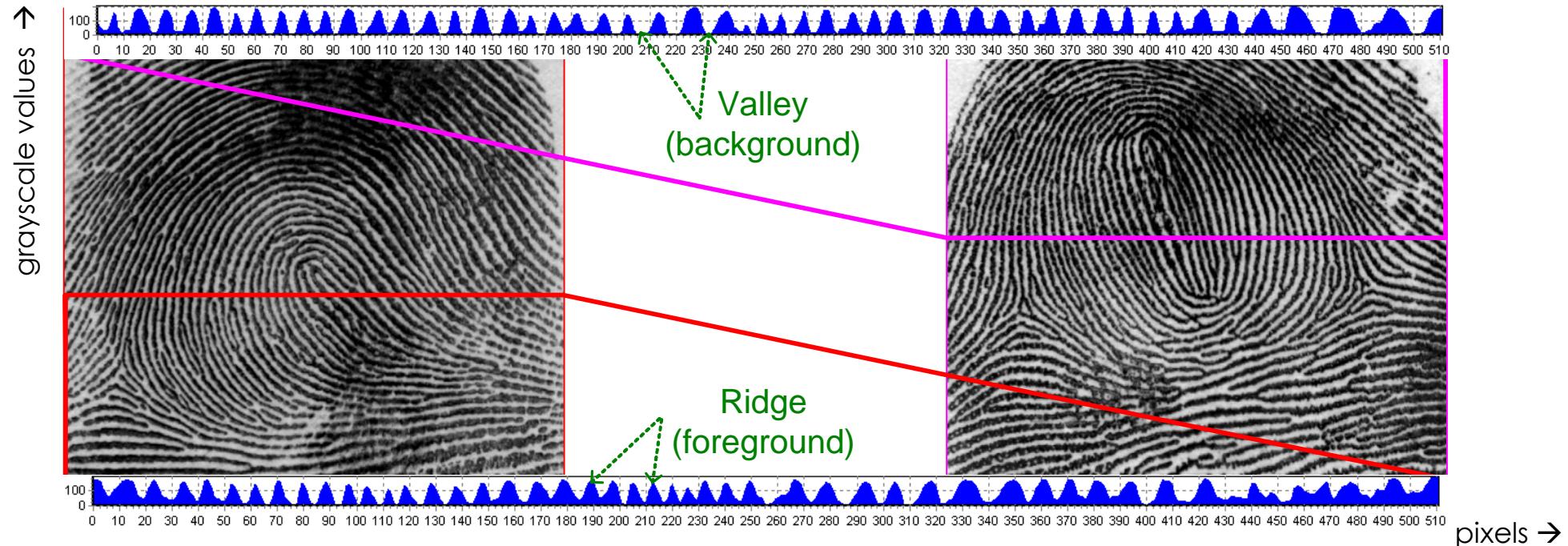
Sensor	SFM3000	SFM3010	SFM3020	SFM3050
Horizontal minimum	6.00	6.00	9.00	10.00
Horizontal average	12.86	19.30	19.93	21.25
Horizontal maximum	23.00	27.00	30.00	31.00
Vertical minimum	5.00	3.00	11.00	11.00
Vertical average	13.26	33.18	22.79	25.67
Vertical maximum	24.00	51.00	31.00	37.00



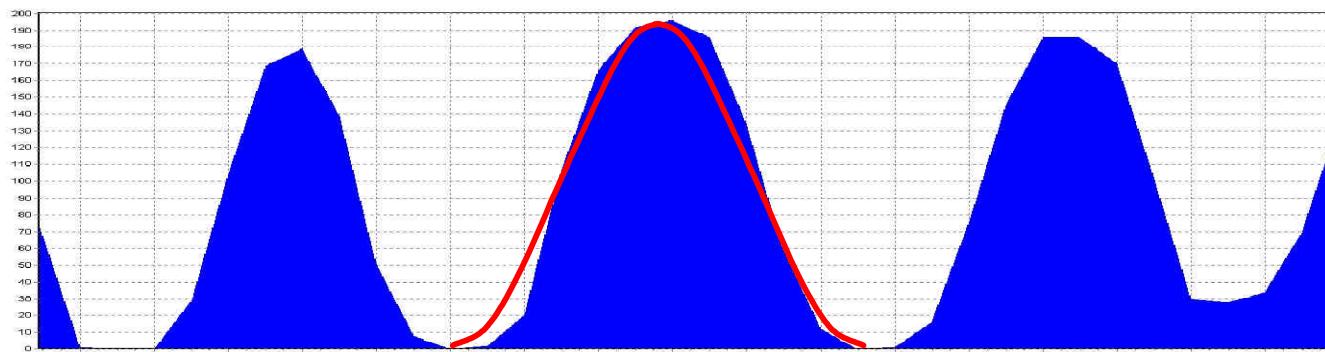
**SFM3010, unstable**



- Crosscut of the fingerprint near the center



- Application of sine function to the crosscut



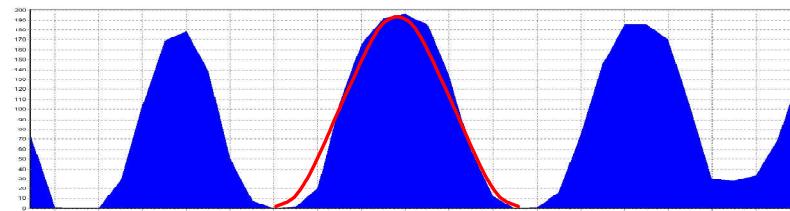
# || Sinusoidal shape II.



- Deviation of the papillary line curvature from the sine function

- $D_D = \left( \frac{A_{FP}}{A_{\sin}} - 1 \right) \cdot 100\%$

- where  $A_{FP} = \int_{x_S}^{x_E} f(x)dx$ ,  $A_{\sin} = \int_{x_S}^{x_E} \sin(x)dx$ ,  $x_S = -\pi/2$ ,  $x_E = 3\pi/2$



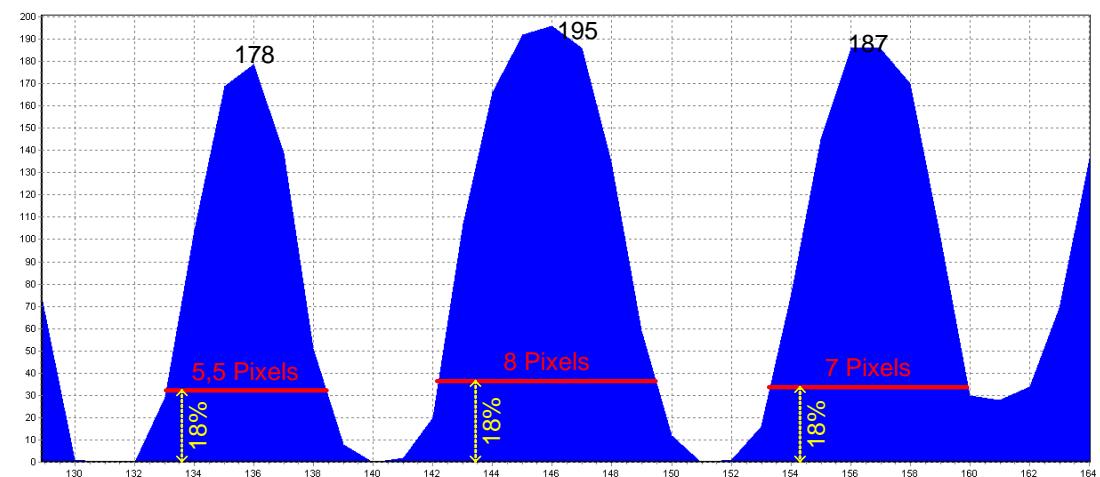
- Deviation of thickness of papillary line from normalized state

- $D_{Th} = \left( \frac{Th}{0.033} - 1 \right) \cdot 100\%$

- where  $Th = \frac{2.54}{R_{DPI}} \cdot N_{Pix}$  [cm]

- $N_{Pix}$  – number of pixels

- $R_{DPI}$  – resolution of the sensor

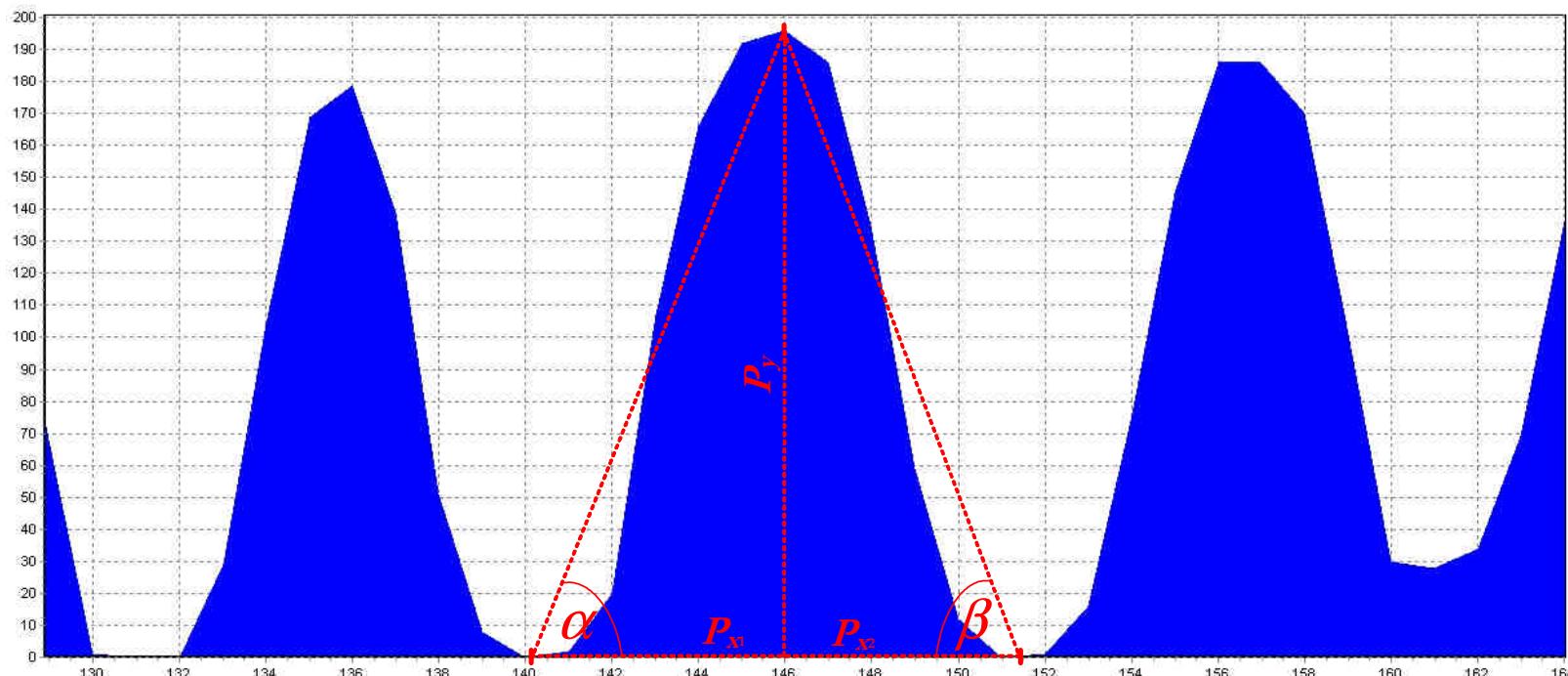


- Deviation of steepness of papillary line from a normalized state

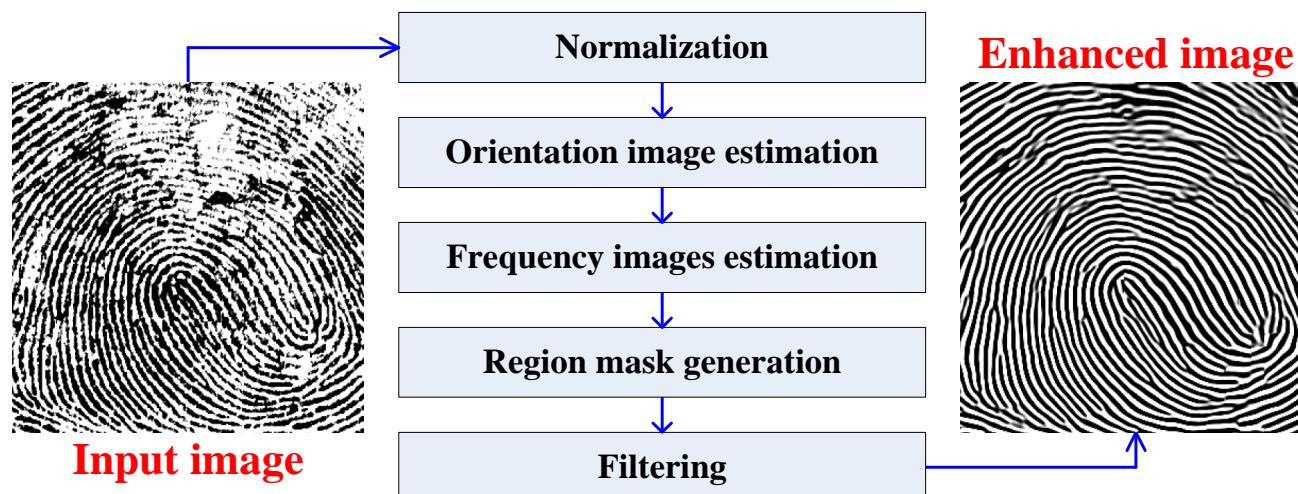
- Deviation of the upward angle  $D_\alpha = \frac{|\alpha - 60^\circ|}{60^\circ} \cdot 100\%$
- Deviation of the downward angle  $D_\beta = \frac{|\beta - 60^\circ|}{60^\circ} \cdot 100\%$

- where

$$\alpha = \arcsin\left(\frac{P_{x_1}}{\sqrt{P_{x_1} + P_y}}\right) \quad \beta = \arcsin\left(\frac{P_{x_2}}{\sqrt{P_{x_2} + P_y}}\right)$$

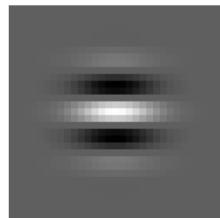
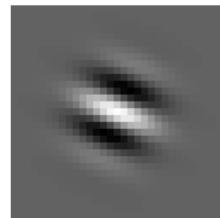
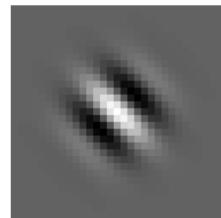
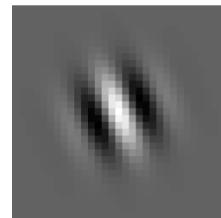
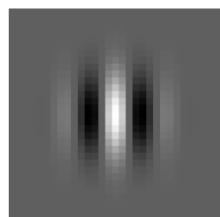
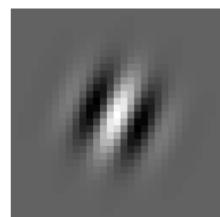
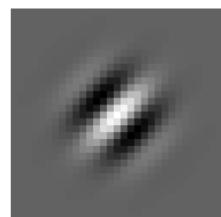
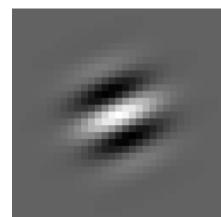
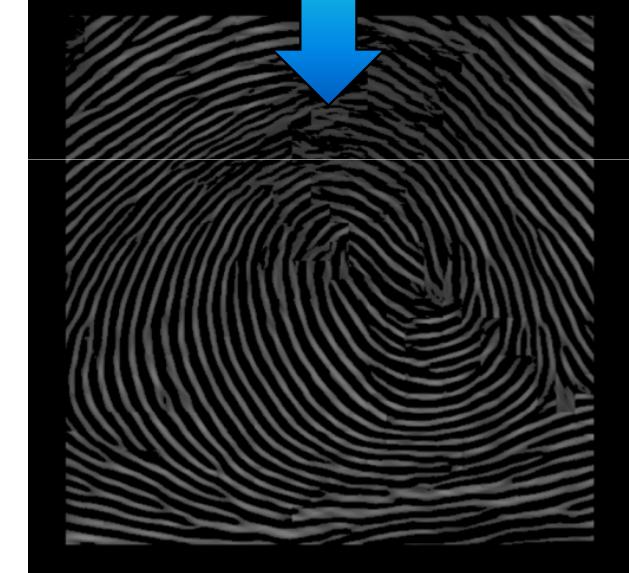
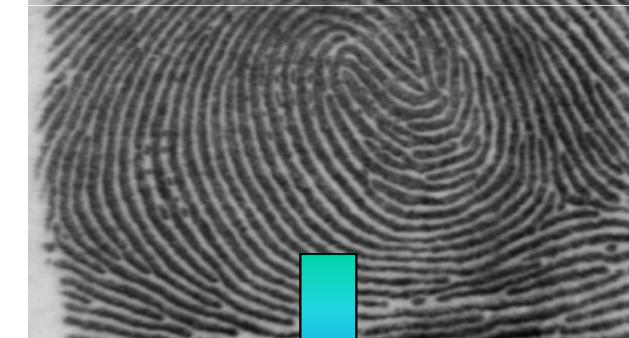
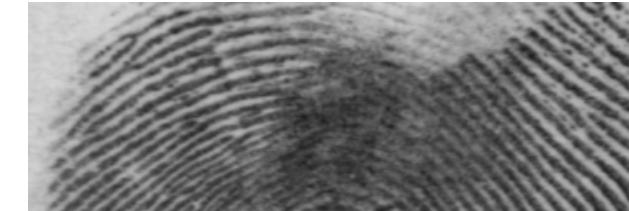
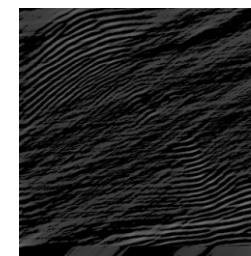
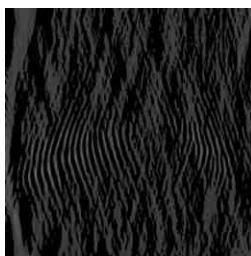
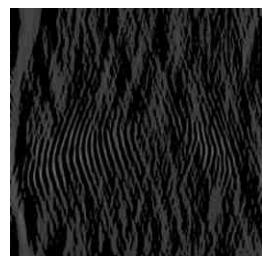
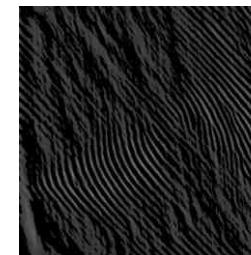
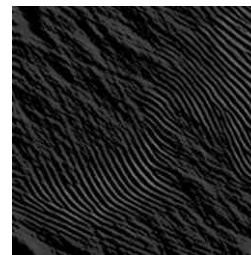
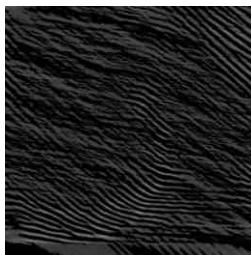
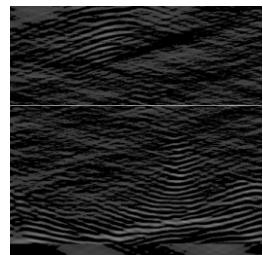


- Normalization – reduction of variations in gray-level values along ridges and valleys
- Orientation image estimation – orientation tendency of papillary lines in local neighborhood
- Frequency images estimation - frequency of ridge and valley structures in local neighborh. along orient.
- Region mask generation – differentiation of pixels to unrecoverable (non-ridge) and recoverable (ridge)



# | Gabor filtering

- 2D Gabor function with 8 rotation about  $22.5^\circ$

(a)  $0^\circ$ (b)  $22.5^\circ$ (c)  $45^\circ$ (d)  $67.5^\circ$ (e)  $90^\circ$ (f)  $112.5^\circ$ (g)  $135^\circ$ (h)  $157.5^\circ$ 

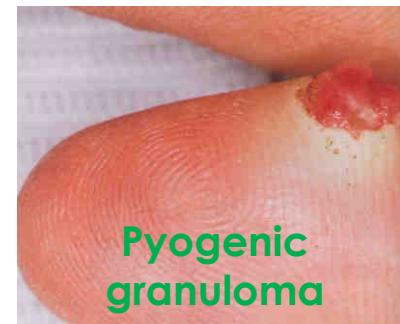
- FFT → Filtering → IFFT
- Used filters for fingerprint enhancement
  - Butterworth filter
    - Maximally flat magnitude filter
  - Ikonomopoulos filter
    - Based on Lin & Hong approach
  - Low-pass filter
    - Classical filtering, however have good results
  - Chebyshev filter
    - Comparable with Butterworth filter, different frequency response

# Skin Diseases

# | Classification of skin diseases



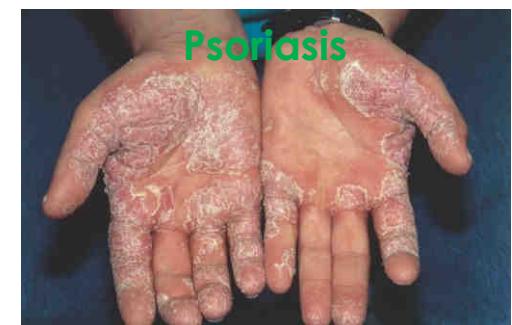
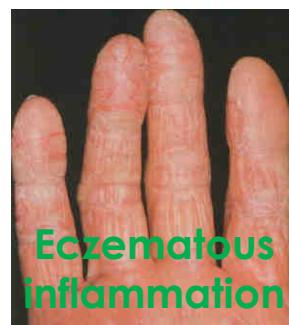
- Change of papillary line structure



- Change of skin color

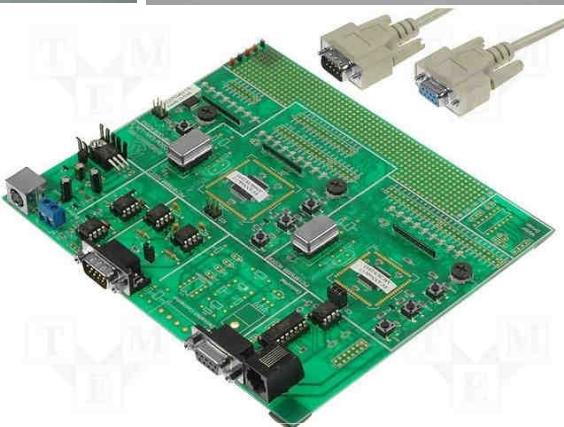


- Change of pap. line structure and skin color



# Biometrics – Equipment

- strade.fit.vutbr.cz





Thank you for your attention.