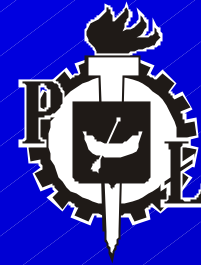




P o l i t e c h n i k a ł ó d z k a
Instytut Elektroniki



WAVELET MODULE FOR MAZDA

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Plan of presentation

- Discrete Wavelet Transform
- Wavelet features
- Wavelet MaZda module
- Test of wavelet module
- Conclusion

Discrete Wavelet Transform (DWT)

**Wavelet transform
equation**

$$T^{wav} f(a, b) = \int_{-\infty}^{\infty} f(t) \frac{1}{\sqrt{a}} \psi\left(\frac{t-b}{a}\right) dt$$

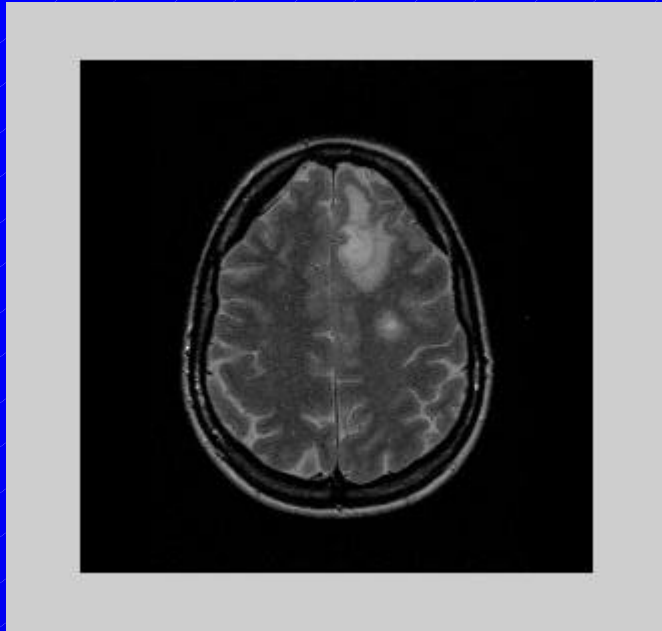
**Discrete wavelet
transform matrix**

$$\begin{bmatrix} 0.5 & 0.5 & & & & & & & \\ 0.5 & -0.5 & & & & & & & \\ & 0.5 & 0.5 & & & & & & \\ & 0.5 & -0.5 & & & & & & \\ & & & \ddots & & & & & \\ & & & & & & 0.5 & 0.5 & \\ & & & & & & 0.5 & -0.5 & \end{bmatrix}$$

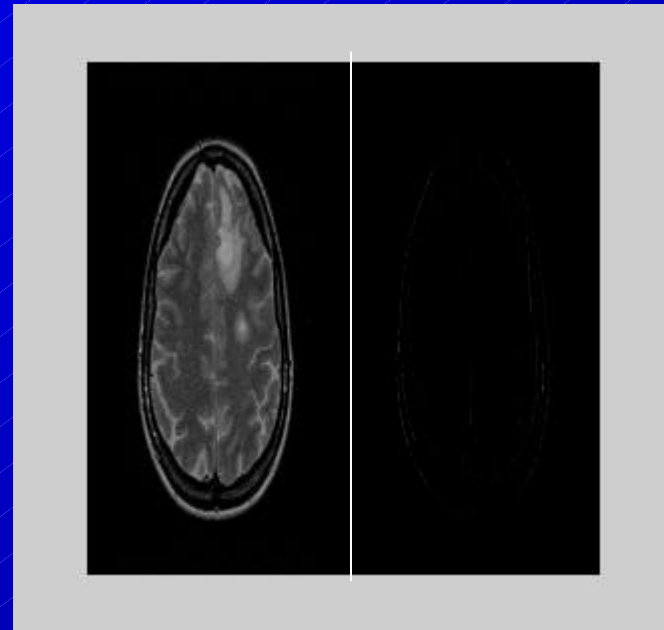
DWT pyramidal algorithm



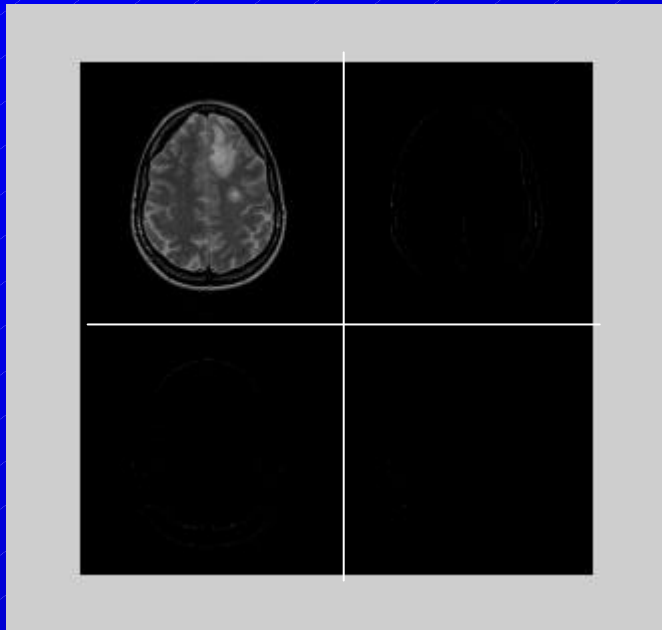
DWT on images



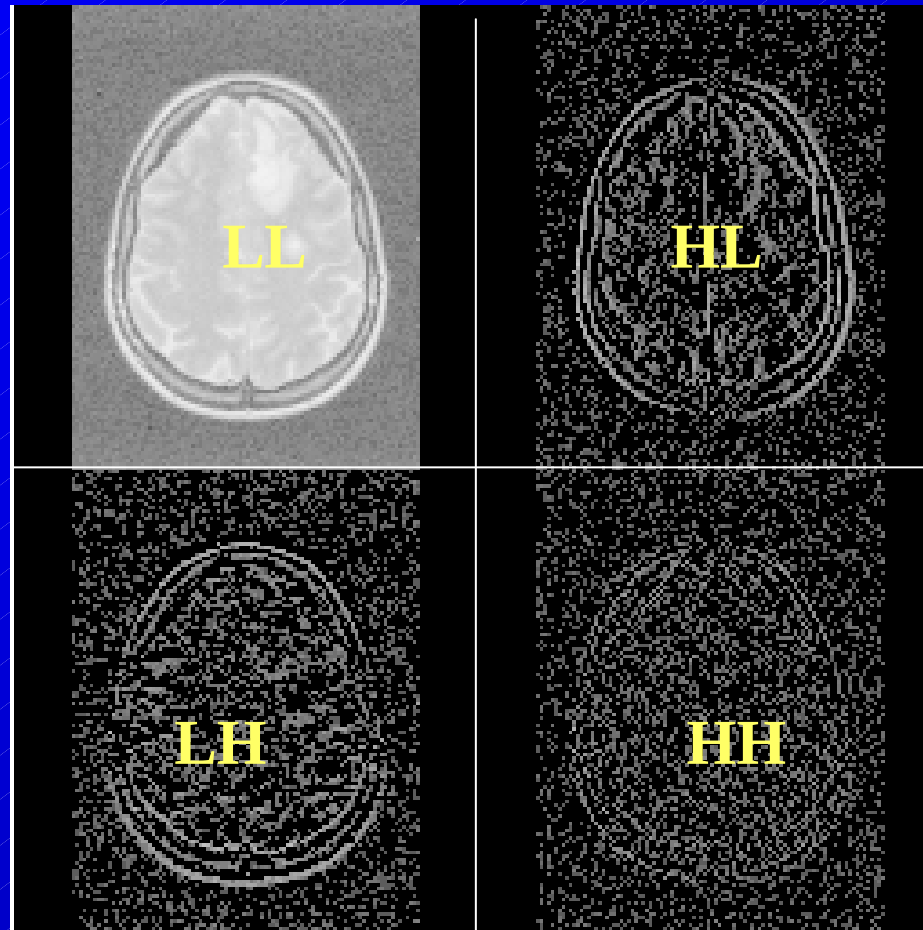
**DWT
in rows**



**DWT
in columns**

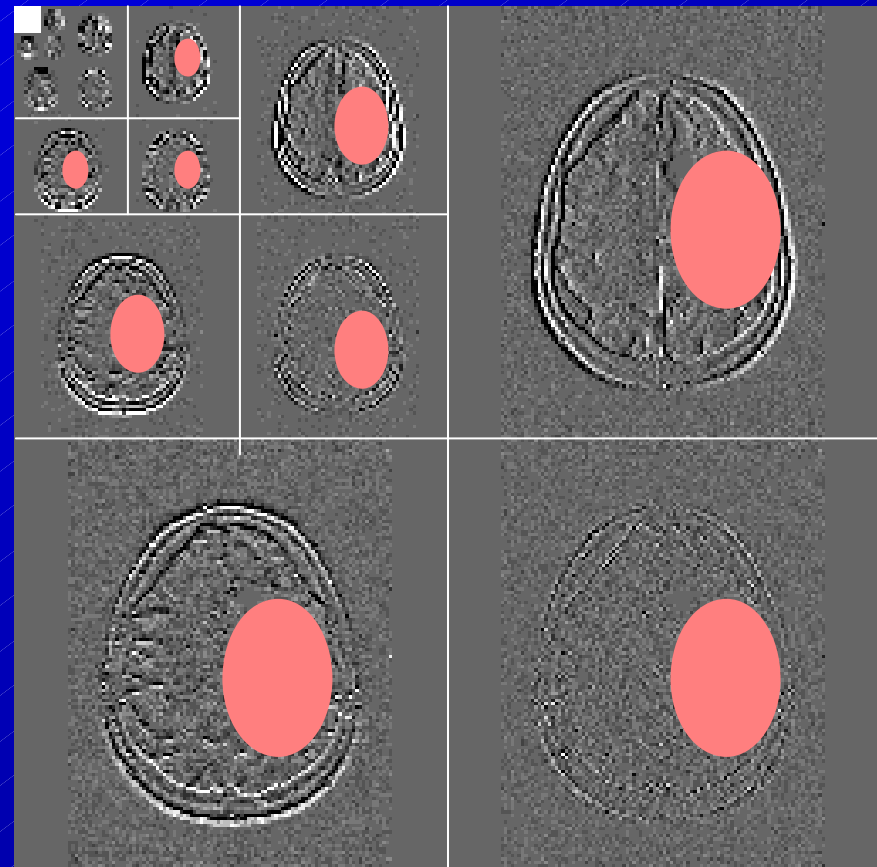


DWT on images

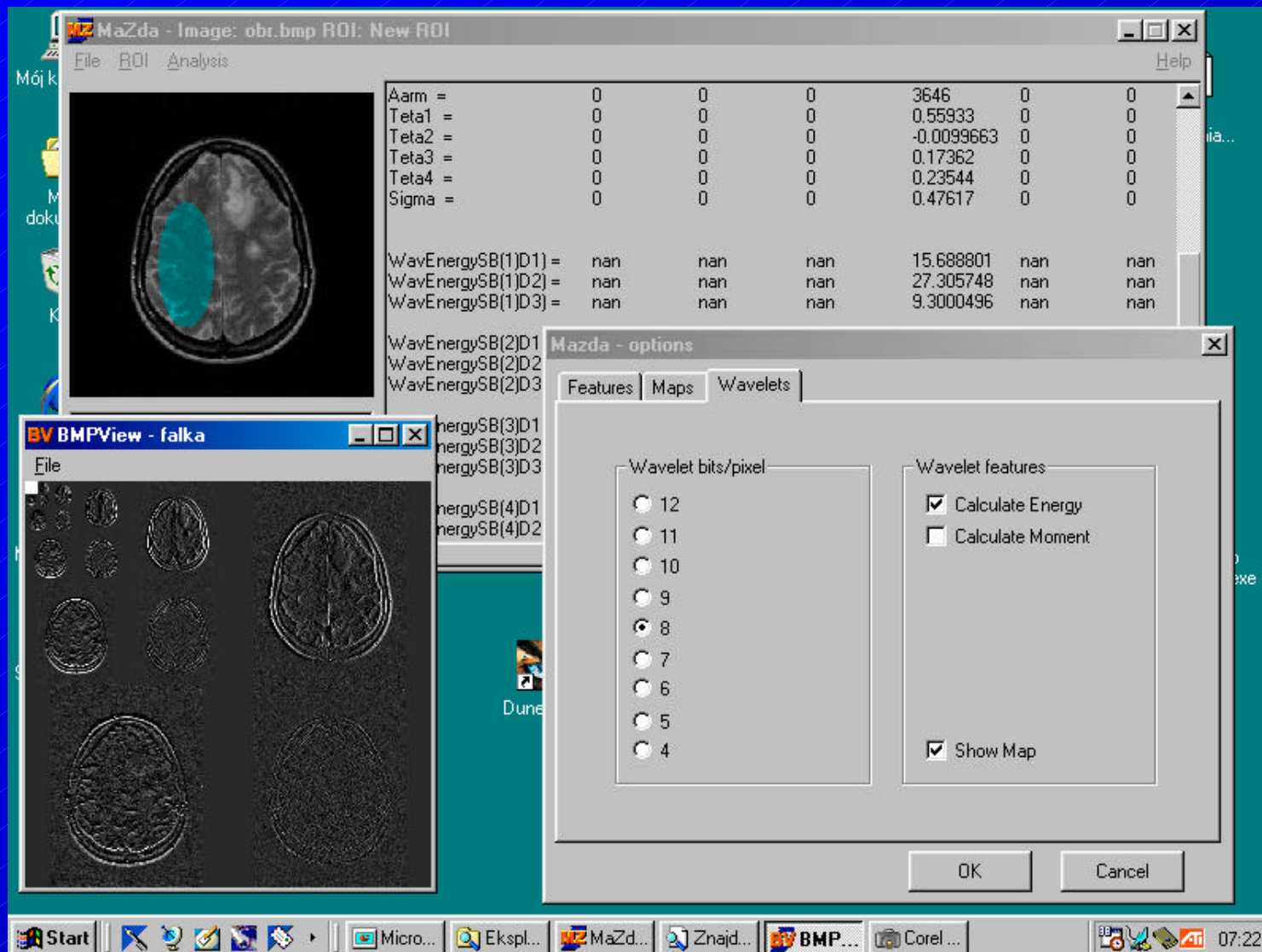


Wavelet texture features

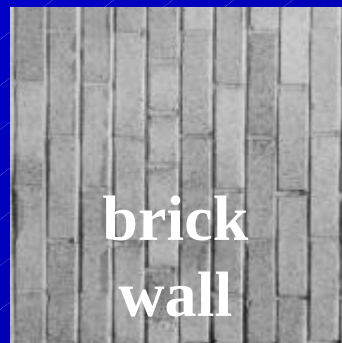
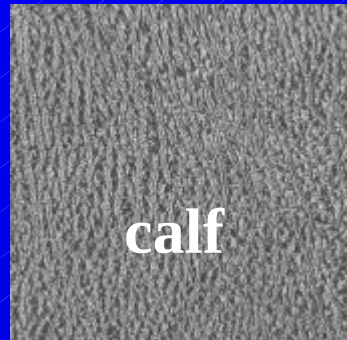
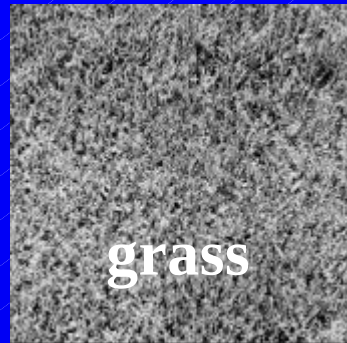
$$E_{subband, scale} = \frac{\sum_{x,y \in ROI} \sum_{i=1}^n |w_{i,x,y}|^2}{n}$$



Wavelet MaZda module



Textures from Brodatz catalogue

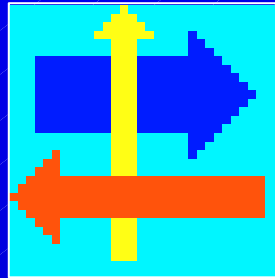


Methods



MaZda

**Vector of 15
wavelet features**



Convert

**10 features
with highest
F coefficients**



B 11

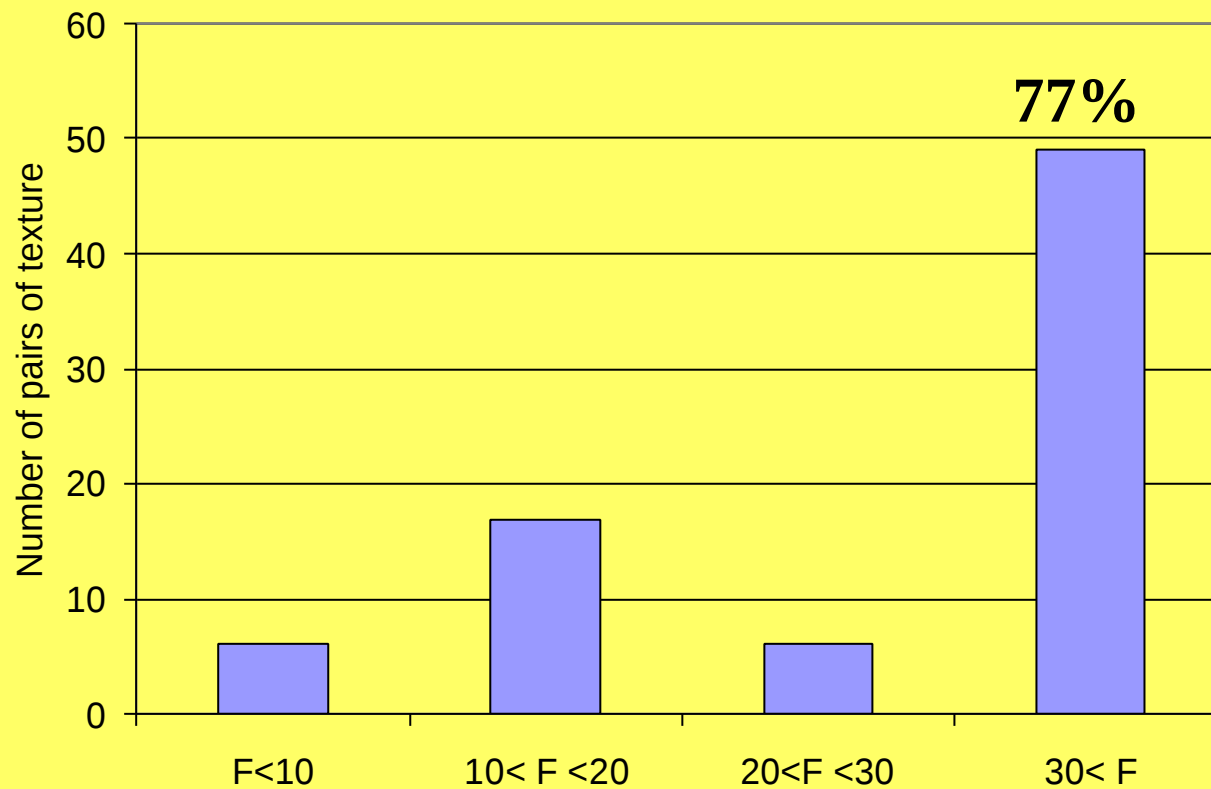
1-NN classifier

Effectiveness of classification for pairs of textures

bark	straw	herringbone weave	woolen cloth	calf	sand	water	wood	raffia	pig skin	brick wall	plastic bubbles	
	y	d	y	y	(2)						d	grass
										d	(2)	bark
		d	d	y	y						d	straw
					d							herringbone weave
					d							woolen cloth
												calf
										d		sand
							y		d			water
												wood
											d	raffia
												pig skin
											d	brick wall

	F coefficient < 5
(2)	-two misclassified samples
	-one feature enough for 0 classification error
d	-two features required for 0 classification error
y	-more than two features required for 0 classification error

Effectiveness of classification for pairs of textures



Conclusions

- **Considered set of wavelet features is a powerful tool for texture separation.**
- **Most of examined pairs of textures can be separated by means of wavelet features with no classification error. A very small classification error (3%) was observed - for only two pairs of textures.**
- **Relatively small-sized vector of DWT features (1-2 elements) is sufficient for very good texture classification.**
- **Future work is planed in this area on applying this method to MRI images.**