

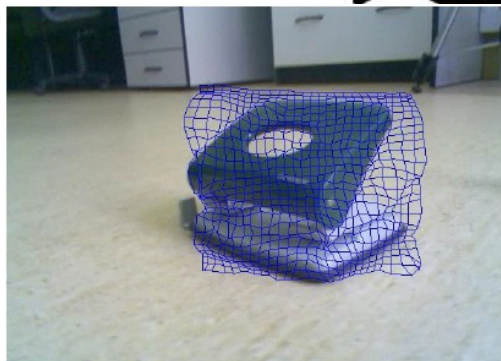
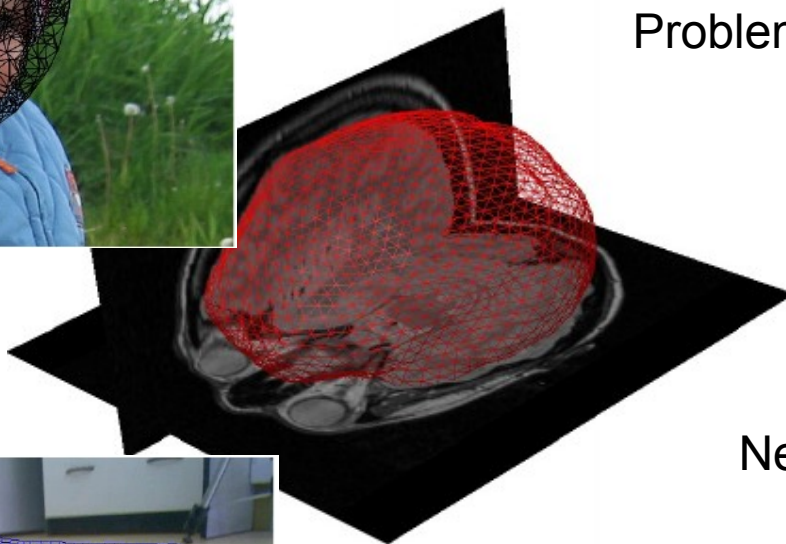
Computer analyses of 2D and 3D images in biomedical and food science domains

Piotr M. Szczypiński

NIST, Gaithersburg, 2016.08.04

Deformable models

General model for tensions modeling



KWT approach
$$E = \int_j \int_i (E_e(i, j) + E_i(i, j)) di dj$$

$$E_i = \tau \left[\left| \frac{\partial \mathbf{v}}{\partial i} \right|^2 + \left| \frac{\partial \mathbf{v}}{\partial j} \right|^2 \right] + \rho \left[\left| \frac{\partial^2 \mathbf{v}}{\partial i^2} \right|^2 + 2 \left| \frac{\partial^2 \mathbf{v}}{\partial i \partial j} \right|^2 + \left| \frac{\partial^2 \mathbf{v}}{\partial j^2} \right|^2 \right]$$

Problem statement

$$\begin{bmatrix} \sum \hat{x}^2 & \sum \hat{x} \hat{y} & \sum \hat{x} \\ \sum \hat{x} \hat{y} & \sum \hat{y}^2 & \sum \hat{y} \\ \sum \hat{x} & \sum \hat{y} & \sum 1 \end{bmatrix} \begin{bmatrix} j_{11} \\ j_{12} \\ t_1 \end{bmatrix} = \begin{bmatrix} \sum \hat{x} x \\ \sum \hat{y} x \\ \sum x \end{bmatrix}$$

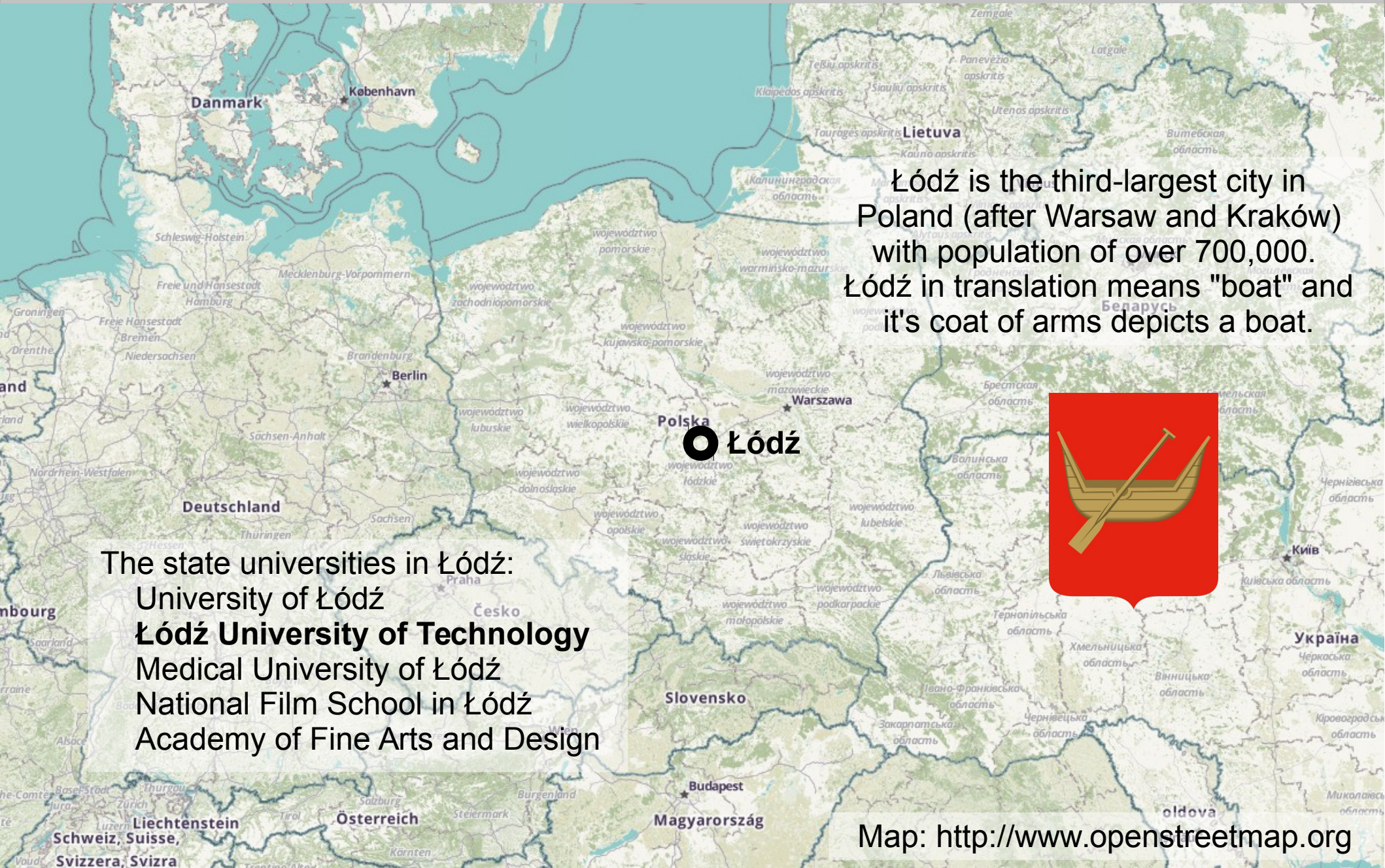
$$\begin{bmatrix} \sum \hat{x}^2 & \sum \hat{x} \hat{y} & \sum \hat{x} \\ \sum \hat{x} \hat{y} & \sum \hat{y}^2 & \sum \hat{y} \\ \sum \hat{x} & \sum \hat{y} & \sum 1 \end{bmatrix} \begin{bmatrix} j_{12} \\ j_{21} \\ t_2 \end{bmatrix} = \begin{bmatrix} \sum \hat{x} y \\ \sum \hat{y} y \\ \sum y \end{bmatrix}$$

New solution

$$\begin{bmatrix} j_{11} \\ j_{12} \\ t_1 \end{bmatrix} = \mathbf{M} \begin{bmatrix} \sum \hat{x} x \\ \sum \hat{y} x \\ \sum x \end{bmatrix}; \quad \begin{bmatrix} j_{21} \\ j_{22} \\ t_2 \end{bmatrix} = \mathbf{M} \begin{bmatrix} \sum \hat{x} y \\ \sum \hat{y} y \\ \sum y \end{bmatrix}$$

$$\mathbf{M} = \frac{\begin{bmatrix} \sum \hat{y}^2 \sum 1 - (\sum \hat{y})^2 & \sum \hat{y} \sum \hat{x} - \sum \hat{x} \hat{y} \sum 1 & \sum \hat{x} \hat{y} \sum \hat{y} - \sum \hat{y}^2 \sum \hat{x} \\ \sum \hat{y} \sum \hat{x} - \sum \hat{x} \hat{y} \sum 1 & \sum \hat{x}^2 \sum 1 - (\sum \hat{x})^2 & \sum \hat{x} \hat{y} \sum \hat{x} - \sum \hat{x}^2 \sum \hat{y} \\ \sum \hat{x} \hat{y} \sum \hat{y} - \sum \hat{y}^2 \sum \hat{x} & \sum \hat{x} \hat{y} \sum \hat{x} - \sum \hat{x}^2 \sum \hat{y} & \sum \hat{x}^2 \sum \hat{y}^2 - (\sum \hat{x} \hat{y})^2 \end{bmatrix}}{\sum \hat{x}^2 \sum \hat{y}^2 \sum 1 - (\sum \hat{y})^2 \sum \hat{x}^2 - (\sum \hat{x} \hat{y})^2 \sum 1 - (\sum \hat{x})^2 \sum \hat{y}^2 + 2 \sum \hat{y} \sum \hat{x} \sum \hat{x} \hat{y}}$$

Łódź Lodz



Łódź is the third-largest city in Poland (after Warsaw and Kraków) with population of over 700,000. Łódź in translation means "boat" and it's coat of arms depicts a boat.



The state universities in Łódź:
University of Łódź
Łódź University of Technology
Medical University of Łódź
National Film School in Łódź
Academy of Fine Arts and Design

Łódź Lodz

Thaddeus Kosciuszko
monument,
Washington DC



The Puck Building,
New York City



Tadeusz Kościuszko
monument, Plac Wolności
(Liberty Square), the exact
center of Łódź

Manufaktura shopping
center in Łódź



Politechnika Łódzka

Lodz University of Technology



Politechnika Łódzka

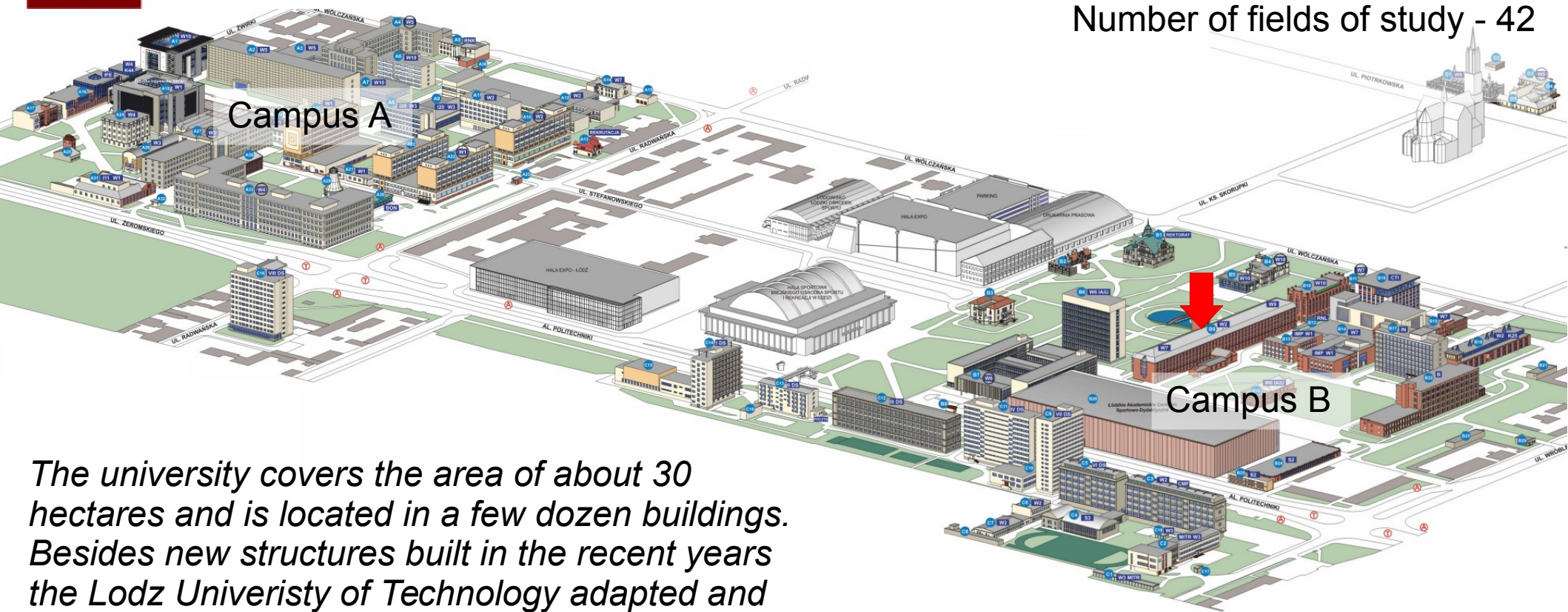
Year of founding - 1945

Total number of staff - 2 829

Number of academic staff (professors) - 1 356 (245)

Number of students B.Sc, M.Sc (Ph.D) - 18 698 (677)

Number of fields of study - 42



The university covers the area of about 30 hectares and is located in a few dozen buildings. Besides new structures built in the recent years the Lodz Univeristy of Technology adapted and revitalized a few historic 19th century villas and factory buildings, adjusting them to its needs.

<http://www.p.lodz.pl/>

Politechnika Łódzka

Lodz University of Technology

Lodz University of Technology

Faculty of Mechanical Engineering

Faculty of Electrical, Electronic, Computer and Control Engineering

Faculty of Chemistry

Faculty of Material Technologies and Textile Design

Faculty of Biotechnology and Food Sciences

Faculty of Civil Engineering, Architecture and Environmental Engineering

Faculty of Technical Physics, Information Technology and Applied Mathematics

Faculty of Organization and Management

Faculty of Process and Environmental Engineering

Institute of Electrical Engineering Systems

Institute of Automatic Control

Institute of Mechatronics and Information Systems

Institute of Electrical Power Engineering

Institute of Electronics

Institute of Applied Computer Science

Department of Microelectronics and Computer Science

Department of Electrical Apparatus

Department of Semiconductor and Optoelectronic Devices

Institute of Electronics



↓ The Director:
prof. dr hab. inż. Paweł Strumiłło

↓ dr hab. inż. Piotr Szczypinski

↓ dr inż. Marcin Kociołek

<http://www.eletel.p.lodz.pl/>

Instytut Elektroniki

Institute of Electronics

Medical Electronics Division

Processing and analysis of biomedical images and signals

Design of systems supporting people with disabilities

Electronic systems for biosignals measurement and data transmission

Human-computer interfaces, brain-computer interfaces

Programming and computations (machine learning, process modeling and simulations)

Telecommunications Division

Propagation of radio waves modeling

Antennas and wireless communication systems design and measurements

Body area network design, body sensors

Radio wave localization systems

Applications of computational intelligence in ICT networks and optimization

Modeling, design and testing of specialized integrated circuits

Electronic Circuits and Thermography Division

Applications of high sensitivity bolometric sensors and cameras

Measurements of thermal impedance

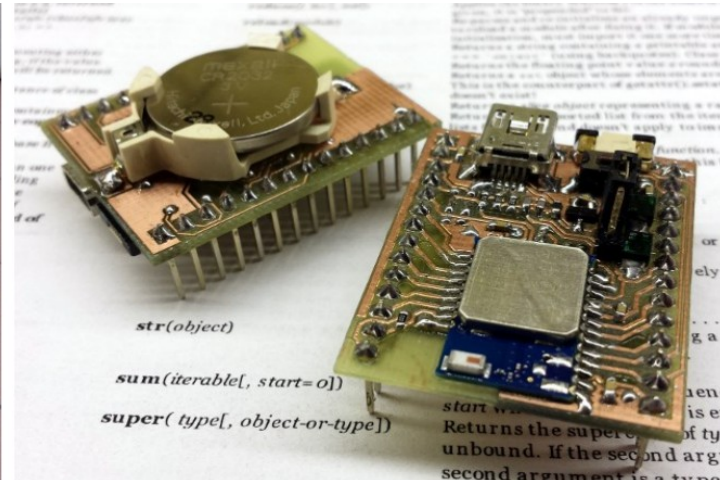
Analysis of thermal processes and electromagnetic phenomena in electronic micro-structures

Thermal issues inverse problem solutions

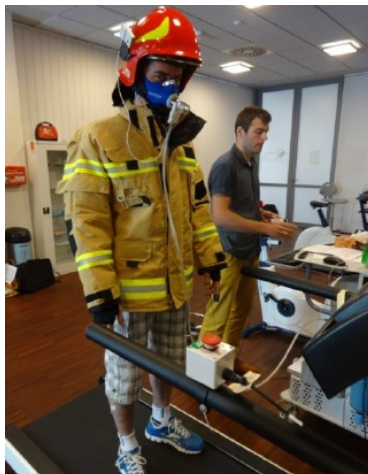
Human skin thermal modeling

Institute of Electronics Student Research Groups

MIPSA - Embedded Systems Student Research Group



TELIN - Telecommunication, Electronics and Informatics Student Research Group



My research

Food quality

- Wheat grain drying effects
- Potato varieties recognition
- Barley variety recognition
- Barley quality assessment
- Cold meats quality evaluation

Medical diagnosis

- Heart ventricles modeling
- Human organs diagnosis
- Endoscopy diagnosis support
- Blood vessel tree modeling
- MR angiography simulation

Algorithms development

- Deformable models
- Image segmentation
- 3D modeling
- Texture and color analysis
- Discriminant analysis
- Data conversion

Programming

- MaZda/qmazda
- Vesselknife
- Ziarna (Grains)
- ParticlesWizard

Potato varieties recognition

Input

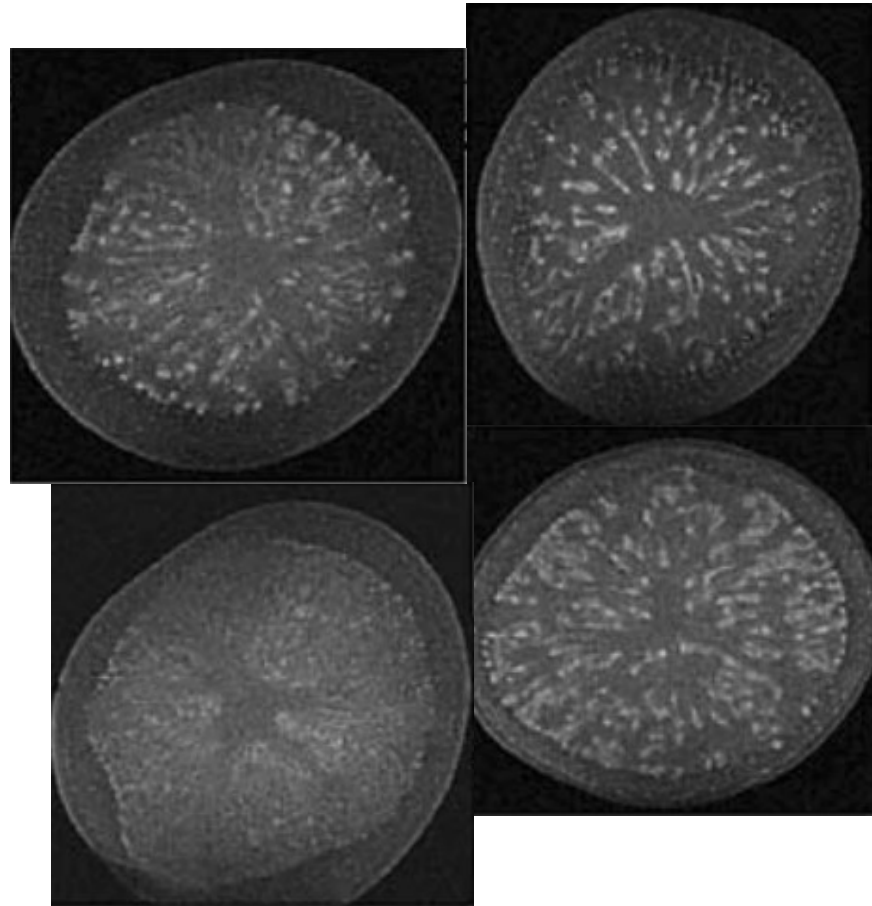
- MRI cross-sections of potatoes

Methods

- Texture feature computation
- Discriminant analysis

Conclusions

- Potatoes as they grow develop directive, radial texture (starch clusters)
- Texture analysis enables discrimination of potato varieties



Thybo, Anette K., et al. "Prediction of sensory texture quality attributes of cooked potatoes by NMR-imaging (MRI) of raw potatoes in combination with different image analysis methods." *Journal of Food Engineering* 61.1 (2004): 91-100.

Barley variety recognition

Goal

- Selection of barley appropriate for malting

Input

- Visual images of barley grains

Methods

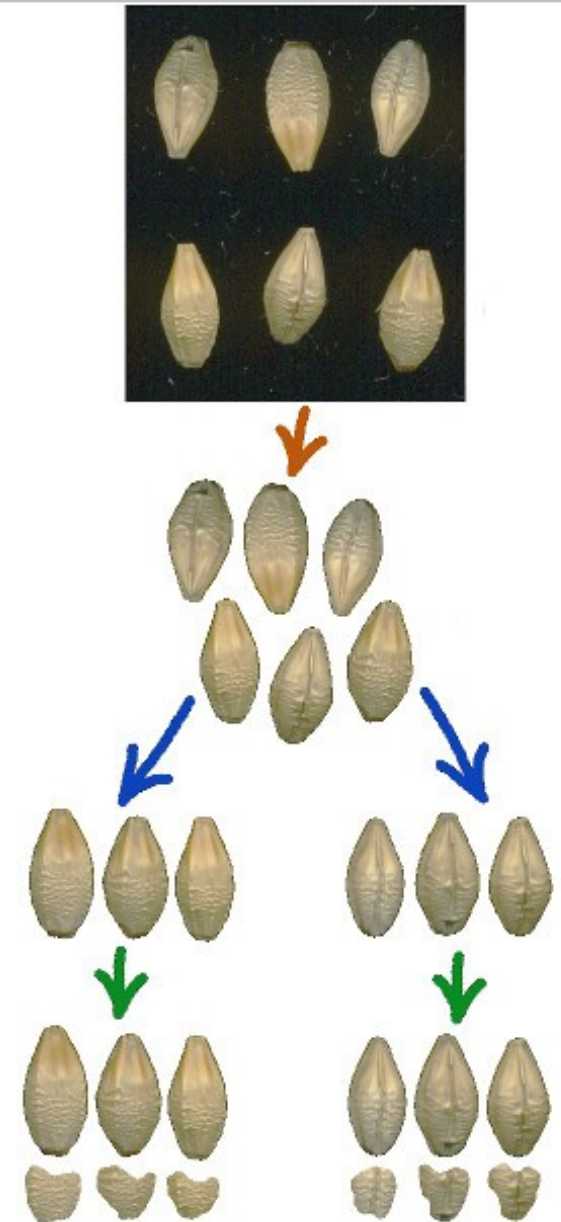
- Shape and image gradient analysis
- Orientation estimation
- Color and texture features computation
- Discriminant analysis

Conclusions

- Ventral and dorsal sides features are complementary
- Shape, color and texture analysis enable discrimination of varieties

Szczypiński, Piotr M., and Piotr Zapotoczny. "Computer vision algorithm for barley kernel identification, orientation estimation and surface structure assessment." *Computers and electronics in agriculture* 87 (2012): 32-38.

Szczypiński, Piotr M., Artur Klepaczko, and Piotr Zapotoczny. "Identifying barley varieties by computer vision." *Computers and Electronics in Agriculture* 110 (2015): 1-8.



Cold meats quality evaluation

Goal

- To estimate proportions of ingredients

Input

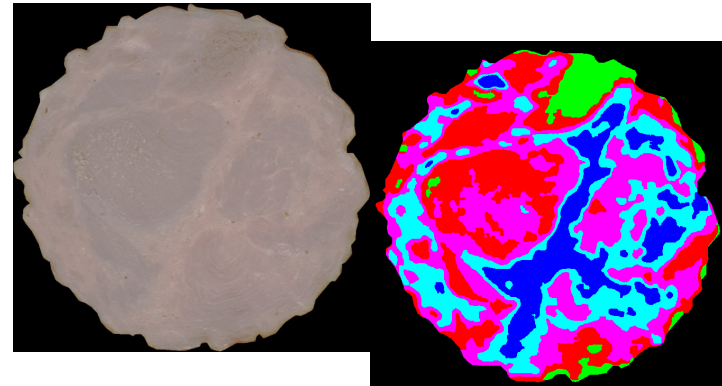
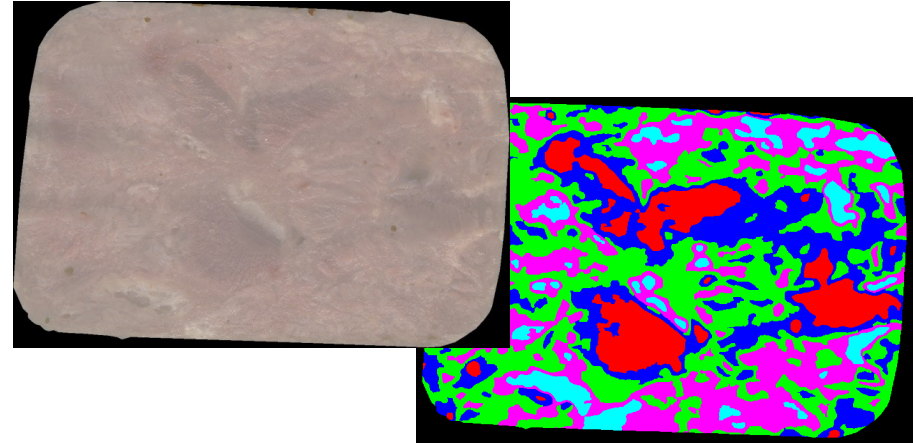
- Visual and multispectral images of cold meats slices

Methods

- Texture and color feature maps computation
- Image segmentation (supervised and unsupervised)

Conclusions

- Texture and color enables segmentation of roughly grinded meats
- Selected texture and color features correlate with mechanical and chemical quality measures



Zapotoczny, Piotr, Piotr M. Szczypiński, and Tomasz Daszkiewicz. "Evaluation of the quality of cold meats by computer-assisted image analysis." *LWT-Food Science and Technology* 67 (2016): 37-49.

Endoscopy diagnosis support (NIST)

Goal

- Represent the gastrointestinal tract as a 2D map

Input

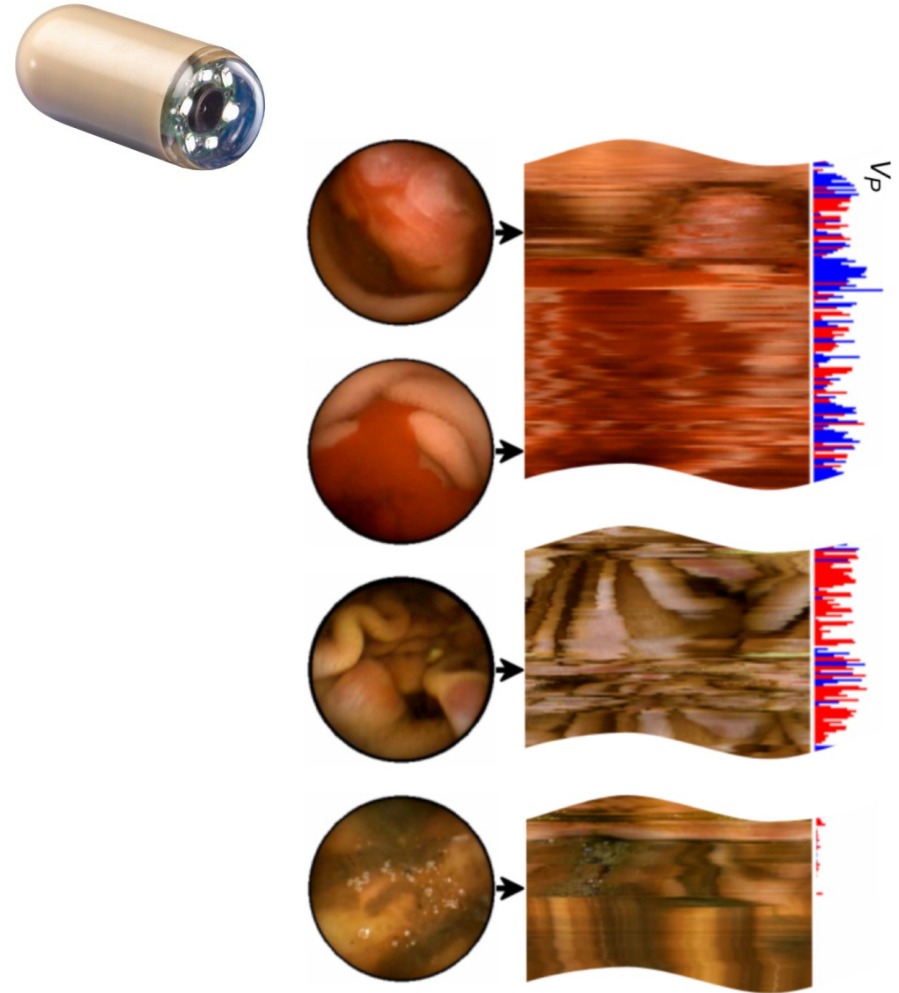
- Video from wireless capsule endoscope

Methods

- Capsule's egomotion analysis by deformable model and optical flow
- Synthesis of small intestine internal surface image (map)

Conclusions

- Maps enable quick identification of large abnormalities and froth
- Using a map results in higher rates of abnormality detection



Szczypiński, Piotr M., et al. "A model of deformable rings for interpretation of wireless capsule endoscopic videos." *Medical Image Analysis* 13.2 (2009): 312-324.

Endoscopy diagnosis support (LUT)

Goal

- Automate detection and quantification of abnormalities (bleedings, ulcers, polyps, etc.)

Input:

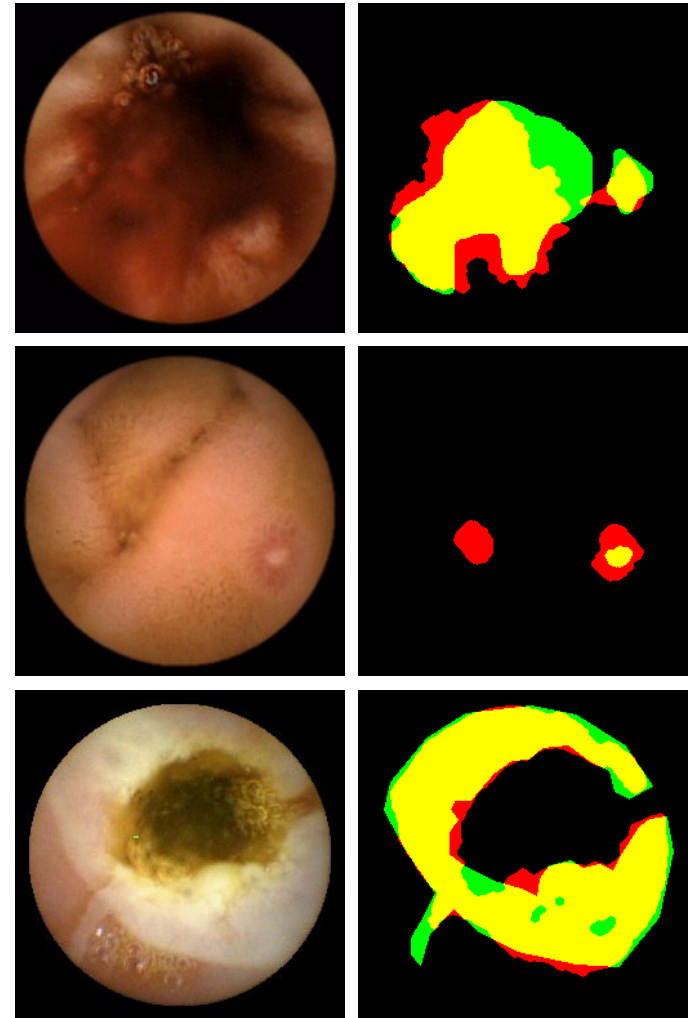
- Video from wireless capsule endoscope

Methods:

- Texture and color analysis
- Discriminant analysis (supervised)
- Image segmentation

Conclusions:

- Texture and color features enable detection of abnormalities
- Texture and color based segmentation enables quantification of abnormality



Szczypiński, Piotr, et al. "Texture and color based image segmentation and pathology detection in capsule endoscopy videos." *Computer methods and programs in biomedicine* 113.1 (2014): 396-411.

MR angiography simulation

Goal

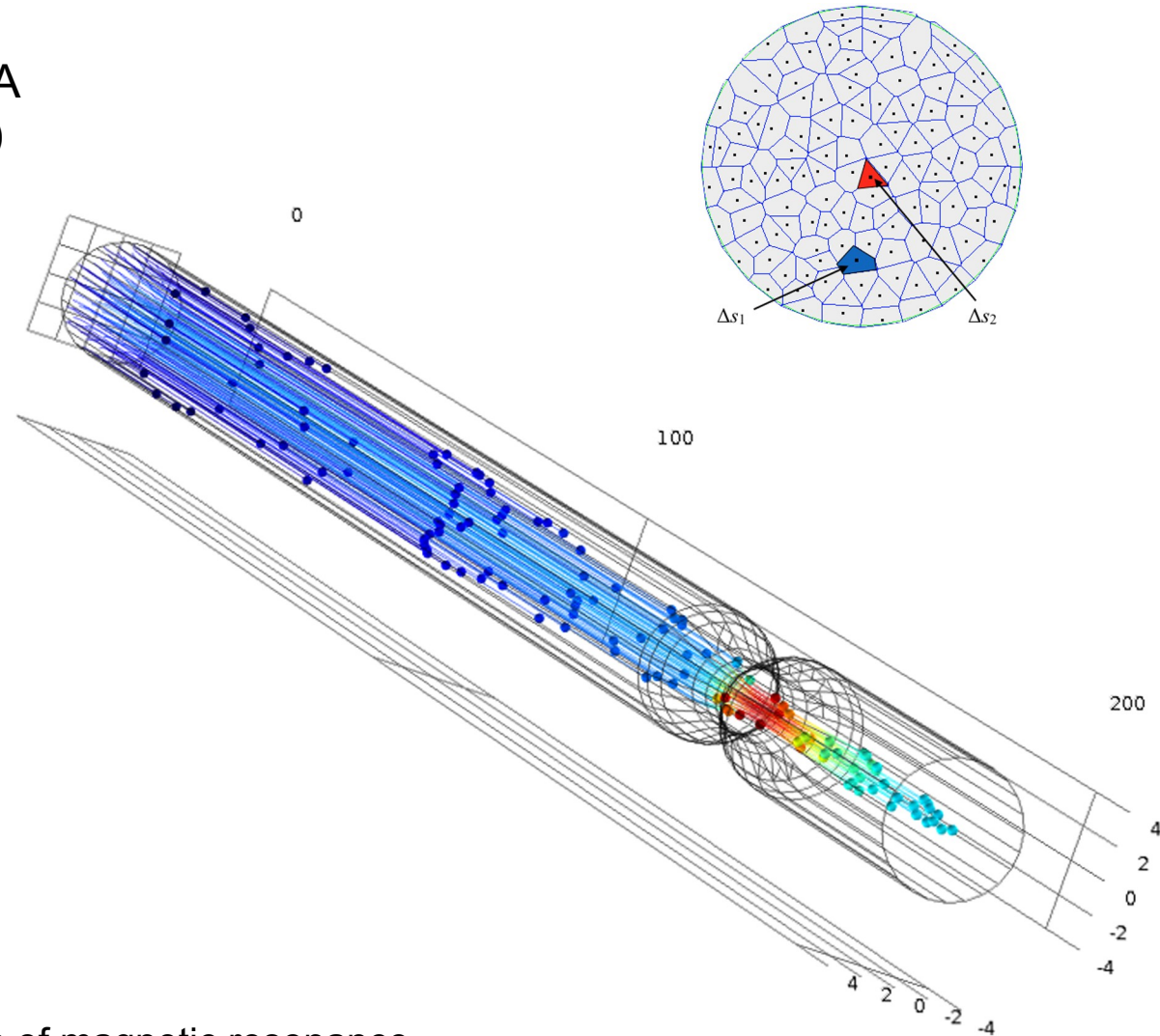
- To simulate dynamic effects in MRA (Magnetic resonance angiography)
- Not to work too hard

Method

- 3D modeling
- Blood flow simulation (COMSOL)
- Particle tracking
- TOF-MOTSA effect simulation (modified SIMRI)

Results

- Reusability of flow simulation
- Solving problem of digital diffusion



Klepaczko, Artur, et al. "Computer simulation of magnetic resonance angiography imaging: model description and validation." PloS one 9.4 (2014)

Vessel tree modeling

Goal

- To build realistic models for MRA simulations

Input

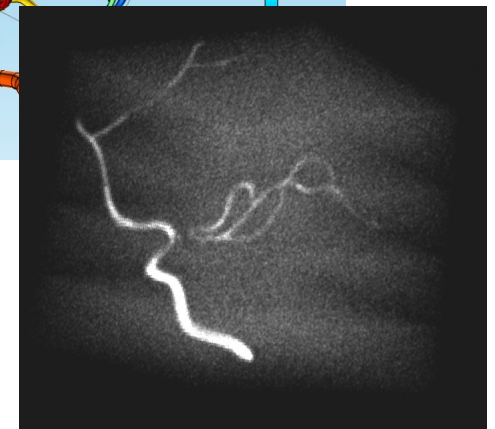
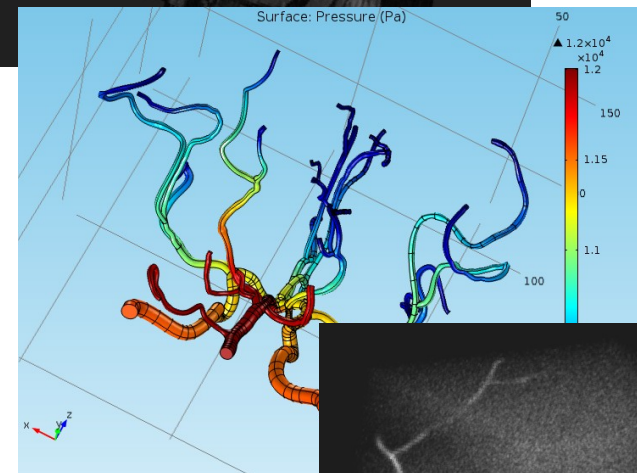
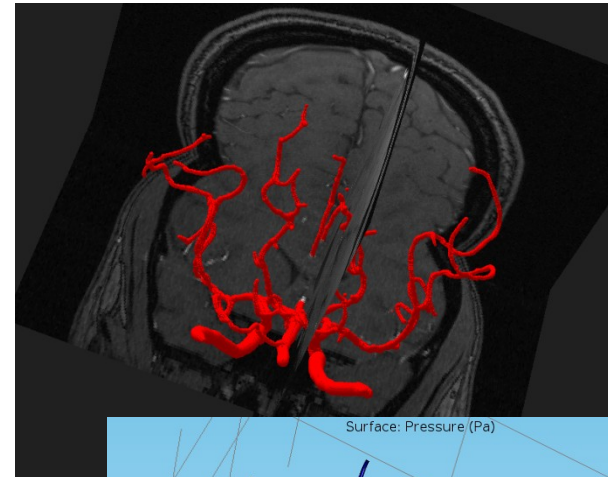
- TOF-MOTSA images
(Time of Flight – Multiple Overlapping
Thin Slab Acquisition)

Method

- Multiscale vesselness function based segmentation
- Skeletonization and centerline tracking
- Diameter estimation (original algorithm)
- Surface smoothing (deformable models)

Results

- Method for modeling of vessel structures with smooth walls
- Simulation results in internal carotid arteries

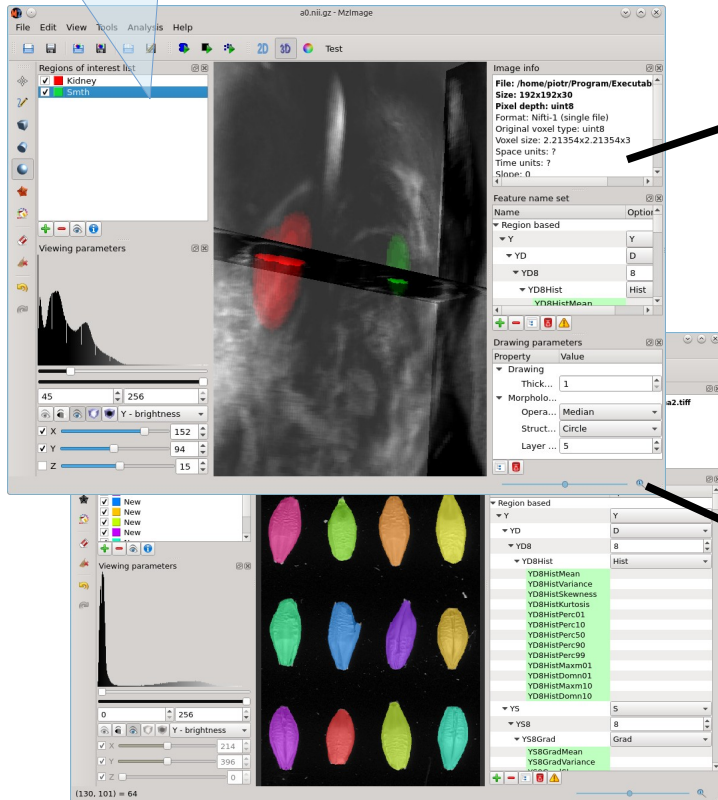


Klepaczko, Artur, et al. "Simulation of MR angiography imaging for validation of cerebral arteries segmentation algorithms." Computer Methods and Programs in Biomedicine (2016 under review)

Mazda/qmazda

gitlab.com/qmazda/qmazda.git

Image segmentation and feature extraction (2D and 3D image data)

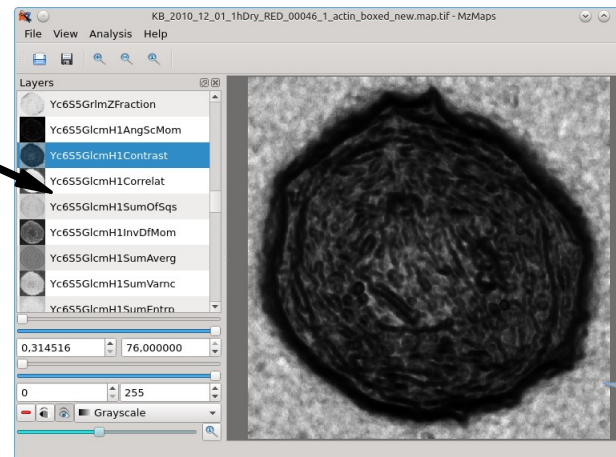
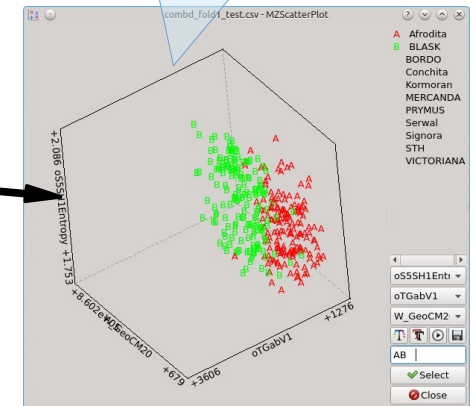


Region related feature vectors

combd_fold1_test.csv - MzReport

	Afrodita	Afrodita	Afrodita	BLASK	BLASK	BLASK	BLASK
o55SH1SumOfSqs	25.0205	24.5367	24.3588	25.1695	25.185	24.4142	23.7403
o55SH1InvDfMom	0.685792	0.68183	0.727904	0.670049	0.672838	0.691839	0.691434
o55SH1SumAverg	32.6099	32.4417	32.5211	32.5185	32.5631	32.6097	32.4981
o55SH1SumVarc	97.9993	95.9342	95.7955	98.7417	98.7636	95.6428	92.7804
o55SH1SumEntrp	1.56834	1.5499	1.53976	1.56991	1.58932	1.56218	1.5557
o55SH1Entropy	1.90946	1.89046	1.82956	1.92206	1.95109	1.89426	1.89409
o55SH1DfVarc	1.42302	1.51504	1.16751	1.23064	1.27952	1.37226	1.50616
o55SH1DfEntrp	0.522721	0.53386	0.478659	0.534957	0.528517	0.523729	0.531395
o55SV1AngScMom	0.016323	0.016925	0.014918	0.013142	0.015448	0.016315	0.016036
o55SV1Contrast	5.07306	4.68053	4.62591	4.56771	4.17321	4.08671	5.33667
o55SV1Correlat	0.894468	0.899499	0.897795	0.905652	0.912573	0.911029	0.878122
o55SV1SumOfSqs	24.0356	23.286	22.6305	24.2068	23.8668	22.9666	21.8934
o55SV1InvDfMom	0.571236	0.586968	0.569504	0.54118	0.588622	0.59393	0.576032
o55SV1SumAverg	32.8307	32.718	32.8432	32.7673	32.82	32.8874	32.8159
o55SV1SumVarc	91.0695	88.4635	85.8961	92.2595	91.294	87.7795	82.937
o55SV1SumEntrp	1.56124	1.54998	1.53853	1.56554	1.58373	1.56374	1.5516

Vector distributions viewer



Saliency map computation and image segmentation.

Validation of classifiers

Confusion matrix

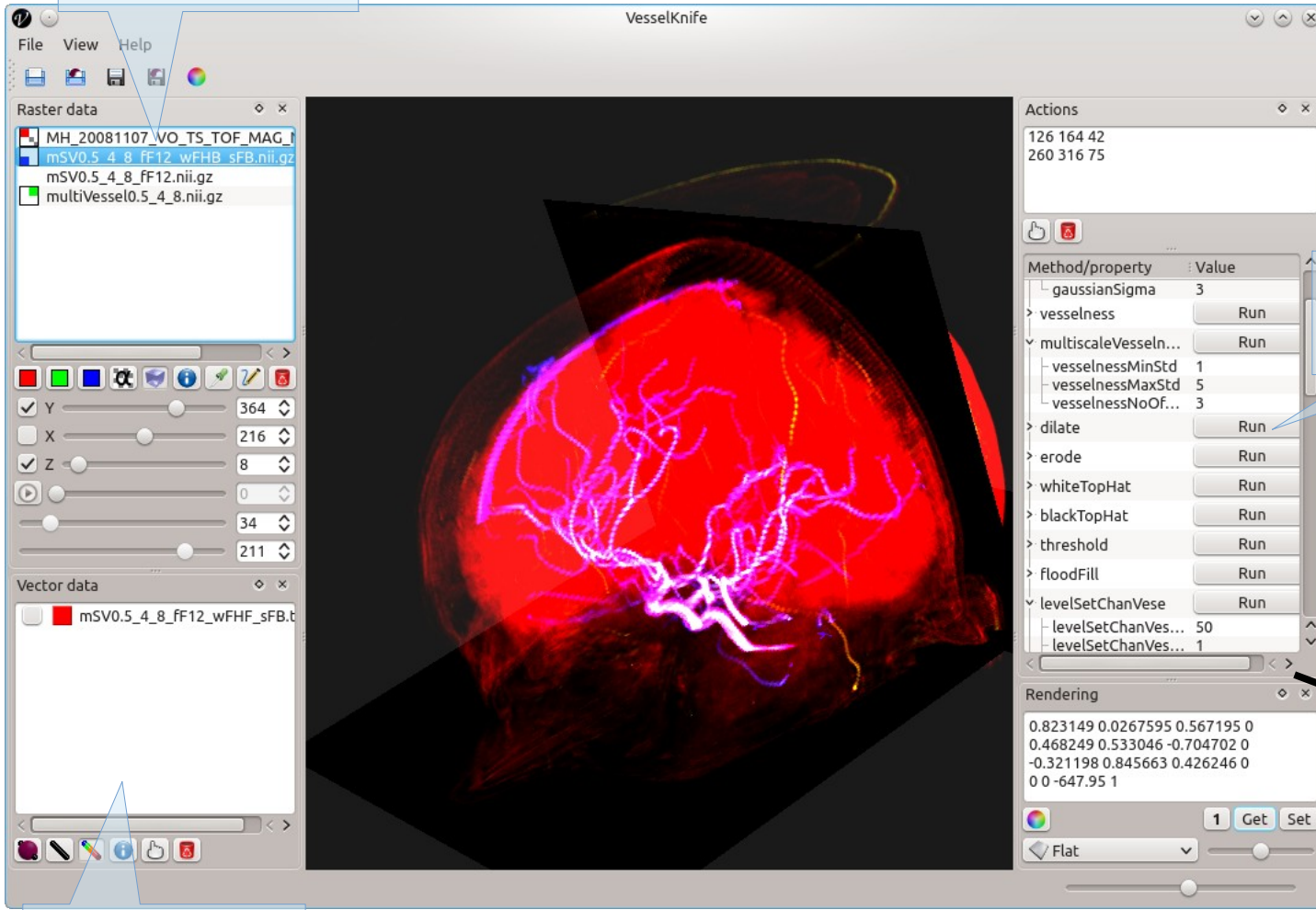
	Afrodita	BLASK	BORDO	Conchita	Kormoran	MERCANDA	PRYMUS	Serwal	Signora
Afrodita	82	0	0	11	4	1	0	10	1
BLASK	0	95	6	1	2	2	3	1	5
BORDO	4	4	92	0	0	3	1	3	2
Conchita	5	2	1	98	9	0	0	10	8
Kormoran	7	3	2	14	64	6	4	3	0
MERCANDA	1	6	3	0	3	68	4	1	6
PRYMUS	1	3	2	0	5	2	83	0	2
Serwal	12	2	0	13	8	0	1	64	4
Signora	4	6	2	5	0	6	1	6	90
STH	13	4	0	1	6	0	3	17	1
VICTORIANA	5	2	4	5	0	4	5	1	18

Szczypiński, Piotr M., et al. "MaZda—A software package for image texture analysis." Computer methods and programs in biomedicine 94.1 (2009): 66-76.

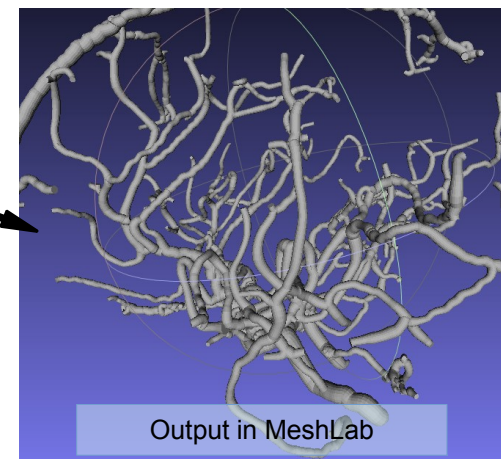
Vesselknife

gitlab.com/vesselknife/vesselknife.git

List of available images.
Visualization of images
in RGB channels



Interface for running
of image processing
algorithms.



List of 3D vector models

Work in progress

Fiber scaffold image segmentation

Input

- Confocal microscopy images of cells and fiber scaffold (separate channels)

Goal

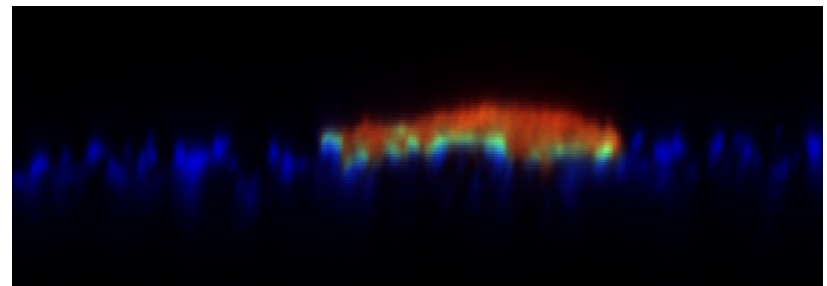
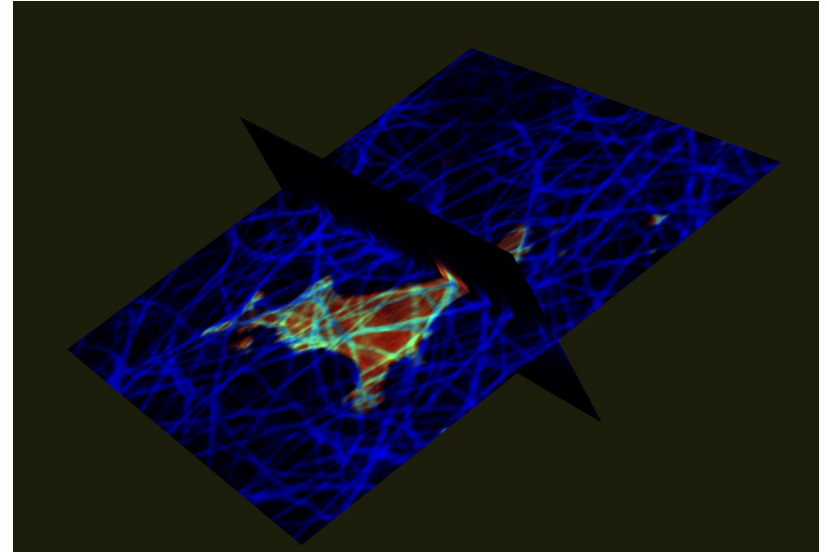
- To indicate attachment areas
- To segment and model cells and scaffold




Problems

- Noise and optical distortions
- Problem with modeling fibers at crossings

Methods to apply

- Vesselness computation
- Image segmentation
- 3D modeling



-  Fiber scaffold channel
-  Cell fluorescence channel
-  Attachment points

Work in progress

Simulations

Input

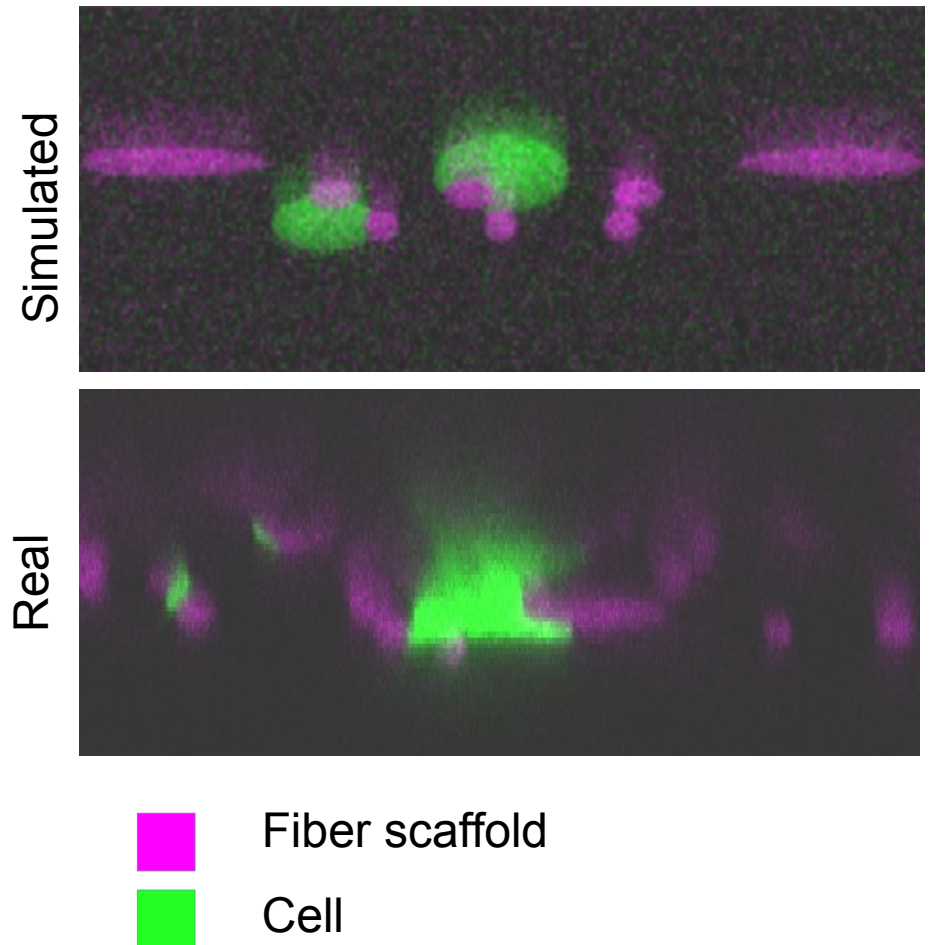
- Scaffold image segmentation algorithms

Goal

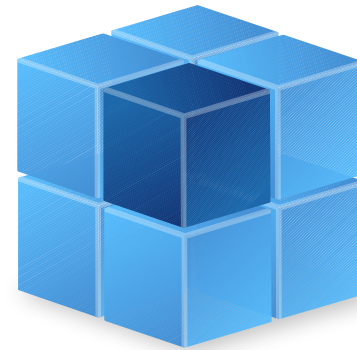
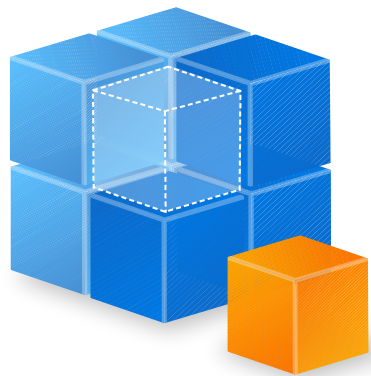
- To generate ground-truth data and realistic images for quantitative validation of developed algorithms

Methods to apply

- Simulation of image acquisition process
 - Cells' and scaffold geometries
 - Partial volume effect
 - Cross-bleeding
 - Optical distortions (PSF Point-spread function)
 - Noise



Summery and discussion



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