

University of Ljubljana  
Faculty of Computer and  
Information Science



# BIOMEDICAL SIGNAL AND IMAGE PROCESSING

Master degree, 1st / 2nd year

Lecturer: Prof. Franc Jager, PhD

Assistant: As. Žiga Pirnar, MSc

Course: 63514

# Course description

- The course introduces **techniques and procedures for analysis of biomedical signals and images** like:
  - Cardiology signals
    - \* electrocardiogram - ECG
  - Neurophysiology signals
    - \* electromyogram - EMG (electrohysterogram - EHG)
    - \* (*electroencephalogram - EEG; See course: Human-Computer Interaction*)
  - Medical images
    - \* computed tomography images - CT images

with the emphasis on **problems of biomedical researches**.



# Course description

- We will recognize how we can **automatically detect and classify heart beats** and then, non-invasive and punctually, within **24-hour electrocardiogram signals**, detect transient **ischaemic disease**, which is one of the most terrible heart diseases, and if we do not discover it punctually, it may lead to **heart infarct**.
- We will recognize how we can, using some non-linear signal processing techniques, analyze **electromyograms** recorded from the abdomen of a pregnant women early during pregnancy (23 week), estimate, or **try to predict, danger of pre-term birth**.
- We will also recognize techniques of analysis of **2- and 3-dimensional tomographic images** with the aim of extraction and **visualization of anatomic structures of human body organs**.

# Course syllabus

- Introduction to Biomedical Signal and Image Processing
- Data Acquisition
- Digital Filters
- Fourier Transform
- The Z Transform
- Frequency-Domain Analysis of Digital Filters
- **Electrocardiogram (ECG) and Detecting Transient Ischaemia**
- Feature Extraction, Shape Representation and Processing of the ECG
- Spectral Analysis
- **Electromyogram (EMG) and Predicting Pre-Term Delivery**
- Non-Linear Signal Processing Techniques



# Course syllabus

- Image Filtering and Enhancement
- Edge Detection and Segmentation of Images
- **Computed Tomography (CT) and Visualization of Human Organs**
- Algorithms to Detect Transient ST Segment Episodes
- Performance Measures and Evaluation
- (Semi-Automatic Graphic Editing Tools to Annotate Ambulatory ECG Records)
- (Selected topics)

# Topics

- The topics cover:
  - Representation of **international standardized databases** of signals and images  
(MIT/BIH DB, LTST DB, TPEHG DB, TPEHGT DS, CTIMG DB)
  - Techniques for **noise extraction**
  - **Spectral analysis**, modeling
  - Techniques for **feature extraction** from signals and images  
(filtering techniques, principal components, Karhunen-Loeve transform, sample entropy, edge detection, contour extraction)
  - Analysis and **visualization** of diagnostic and morphology feature-vector time series, and anatomic structures
  - **Event detection**, clustering, **classifications**
  - **Metrics, techniques and protocols for performance and robustness evaluation** of biomedical computer systems



# Environments, sites, and tools for laboratory sessions

- Web classroom
- PhysioNet site, <http://www.physionet.org>  
(source of resources in the field of biomedical signal and image processing)
  - Databases: MIT/BIH DB, LTST DB, TPEHG DB, TPEHGT DS
  - Software: ATM tools, wfdb library, lightWAVE, gnuplot
- Home pages of Laboratory for Biomedical Computer Systems and Imaging (LBCSI),  
<http://lbcsi.fri.uni-lj.si>
  - Databases: LTST DB, TPEHG DB, TPEHGT DS, CTIMG DB
- Ubuntu 18.04 (LTS), Linux
- C, (C++)
- Matlab

# Literature

- Sornmo Leif, Laguna Pablo, Bioelectrical Signal Processing in Cardiac and Neurological Applications, 2005, Elsevier Inc.
- Clifford Gari D, Azuaje F, McSharry Patrick E (Editors), Advanced Methods and Tools for ECG Data Analysis, 2006, Artech House Inc.
- Proakis J G, Manolakis D G, Digital Signal Processing, 2014, Prentice Hall Inc. (in our library)
- Gonzales Rafael C, Woods Richard E, Digital Image Processing, 3<sup>rd</sup> Edition, 2008, Pearson Prentice Hall.  
  
Gonzales Rafael C, Woods Richard E, Digital Image Processing, 4<sup>th</sup> Edition, 2018, Pearson Prentice Hall.
- Oppenheim Alan V, Schafer Ronald W, Discrete-Time Signal Processing, Third Edition, 2014, Pearson Education Limited. (in our library)
- Lyons Richard G, Understanding Digital Signal Processing, Third Edition, 2011, Pearson Education, Inc. (in our library)



# Laboratory sessions, quiz, exam, grading

- **Laboratory assignments** (each assignment **has to be submitted and explained** ongoing):
  1. Analysis of electrocardiogram (ECG) signals  
and analysis of electromyogram (EMG) signals (Max: 45 - 55 points)
  2. Analysis of computed tomography (CT) images (Max: 55 - 65 points)  
→ **Obligatory: 50 points**; Max: 120 points
- **Quiz** during the semester (by your choice) → Max: 20 points
- **Exam** at the end of semester: → **Obligatory: 50 points**; Max: 100 points
- How the **preliminary grade** (5 - 10) will be composed?

$$\text{Total score} = \text{round} ( ( \text{Laboratory points} + \text{Quiz} + \text{Exam} ) / 2 )$$

$\text{Total score} \leq 49$	→ 5
$50 \leq \text{Total score} \leq 59$	→ 6
$60 \leq \text{Total score} \leq 69$	→ 7
$70 \leq \text{Total score} \leq 79$	→ 8
$80 \leq \text{Total score} \leq 89$	→ 9
$90 \leq \text{Total score}$	→ 10

- **Oral exam is obligatory.**



# Physionet / Computing in Cardiology Challenges

- **Physionet / 2014 Computing in Cardiology Challenge**
  - **Robust Detection of Heart Beats in Multimodal Data**
  - Students at this course participated at the prototype challenge
  - The **actual challenge** started on January 2014 and ended on January 2015
  - **Urška Pangerc** (student at this course) obtained the 2nd, 3rd, 6th, and the **final 1st place** during the phases I, II, III, and the follow-up phase (end of February 2015) of the competition of the **actual challenge** (which was not student competition) **among 47 international teams** ( <http://physionet.org/challenge/2014> )

# PhysioNet / 2014 Computing in Cardiology Challenge

Focus issue entry	Score (%)
Pangerc and Jager (2015)	93.64
Johnson <i>et al</i> (2015)	91.50
Antink <i>et al</i> (2015)	90.70
DeCooman <i>et al</i> (2015)	90.02
Galeotti <i>et al</i> (2015)	89.73
*Vollmer M	89.55
Pimentel <i>et al</i> (2015)	89.13
Mollakazemi <i>et al</i> (2015)	88.85
*Krug J	88.34
Gieraltowski <i>et al</i> (2015)	88.07
C-code sample entry	87.38
M-code sample entry	85.04

**Source:** Silva I, Moody B, Behar J, Johnson A, Oster J, Clifford GD, Moody GB, Editorial: Robust Detection of Heart Beats in Multimodal Data, *Physiological Measurement*, 36:1629–1644, 2015.  
( <http://iopscience.iop.org/0967-3334/36/8/1629> )



# Physionet / Computing in Cardiology Challenges

- **Physionet / 2020 Computing in Cardiology Challenge**
  - The topic has not been decided yet
- Participating at the topics from the past challenges is possible  
(see: <http://physionet.org/challenge/> )