



BIOMEDICAL NETWORK - Members meeting, Bikuben, HUH, Bergen, 22.09 2016, 15:00-18:30

<https://bergento.no/event/biomedical-network-members-meeting>

Computational medicine

(Beregningsorientert medisin)

17:35-17:50

Prof. Arvid Lundervold BSc, MD, PhD

Department of Biomedicine, University of Bergen &
Department of Radiology, Haukeland University Hospital, Bergen, Norway

<https://github.com/arvidl/computational-medicine>



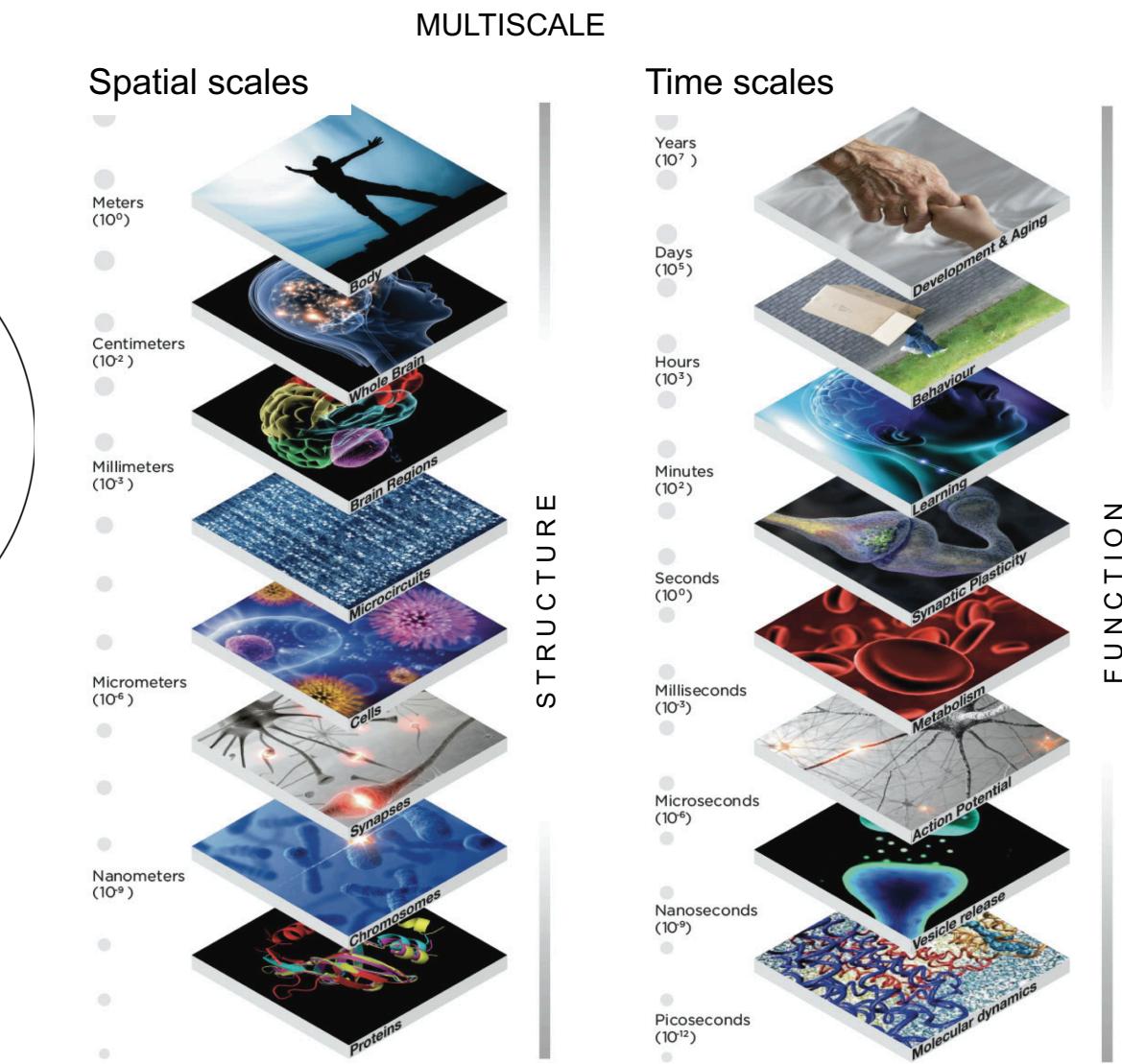
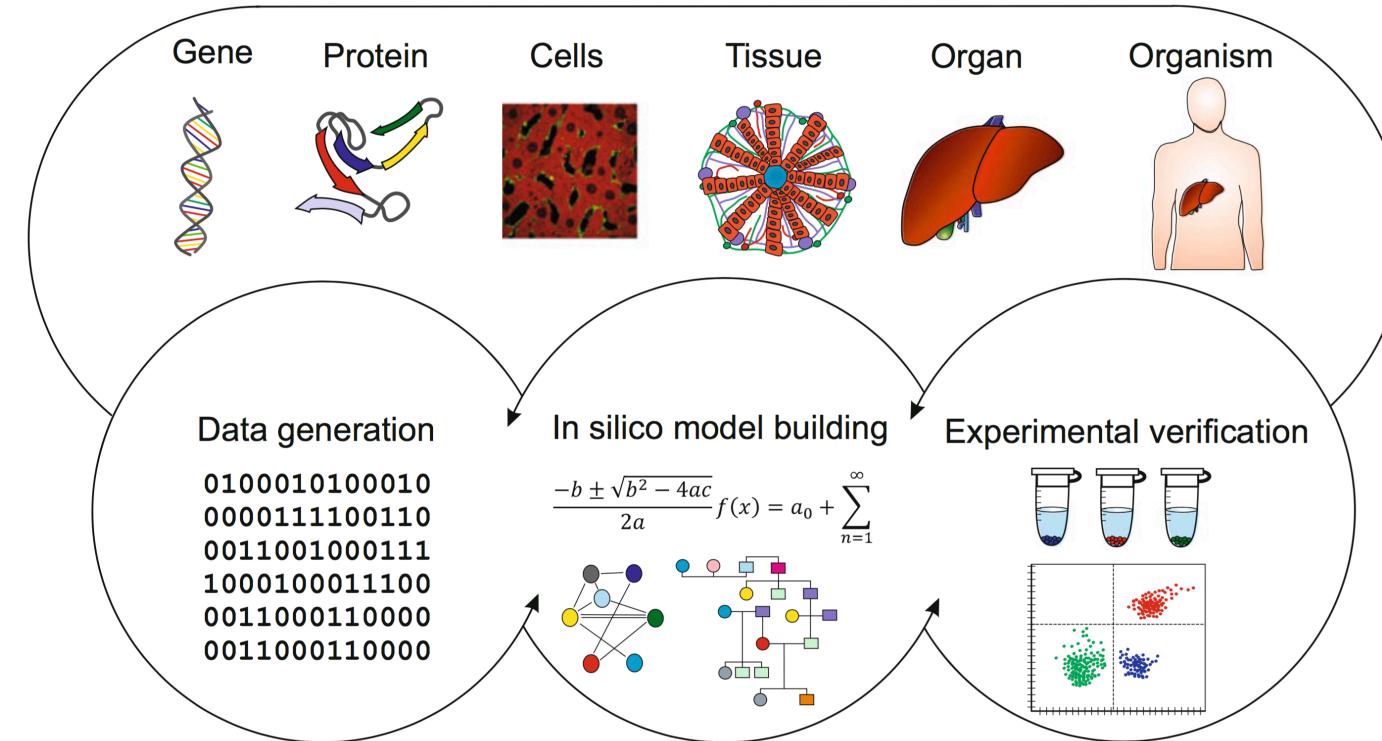
Biomedical Network – members meeting

- *Biomedical Network is a network collaboration between Haukeland University Hospital, University of Bergen, Legemiddelindustrien and Bergen Teknologioverføring (BTO).*
- ***The aim is to establish a common platform for innovation and project development across academic and between public and private actors.***
- *This meeting is the first in a series that will contribute to collaborative research between researchers, research institutions and companies.*

How does “Computational medicine” fit in ?

TRENDS

Systems medicine and computational imaging



Computational Medicine

It will soon be common for clinical research studies to:

- Collect genetic, transcriptional, proteomic, imaging and clinical data from every patient in large, carefully selected cohorts sharing a specific disease diagnosis.

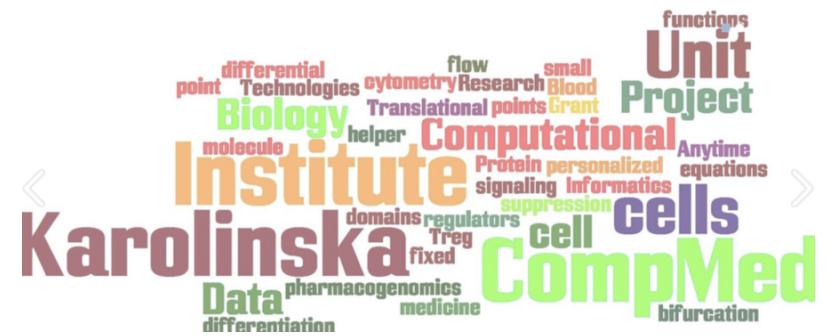
The screenshot shows the homepage of the Johns Hopkins Institute for Computational Medicine (ICM). At the top left is the ICM logo, which consists of a stylized blue 'JHU' monogram next to the text 'INSTITUTE for COMPUTATIONAL MEDICINE'. To the right of the logo is a descriptive text block: 'Johns Hopkins Institute for Computational Medicine (ICM), a remarkable collaboration between Johns Hopkins School of Medicine and Whiting School of Engineering, is using powerful computational tools to transform the practice of medicine.' Below this text is a blue button labeled 'More about our mission'. At the bottom of the page is a navigation bar with links: 'About ICM', 'People', 'Research Thrusts', 'Portals', 'Seminars', 'Publications', 'Education', and 'Community'. On the right side of the page, there are three circular inset images showing complex, multi-colored 3D data visualizations, likely representing medical or biological data.

Johns Hopkins University

- The challenge of the coming decade will be
 - how best to use these *multi-scale* biomedical data
 - to gain a *quantitative understanding* of disease mechanisms
 - across *hierarchical levels* of biological organization
 - to identify *biological markers* which correlate with different disease states
 - and inter-individual differences in *disease risk*
- Discover more effective *therapeutics targeted to the individual*

<http://www.icm.jhu.edu>

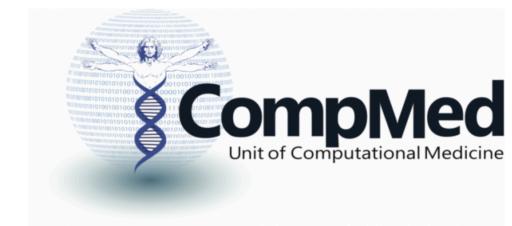
Unit of Computational Medicine - Karolinska Institutet



Uniquely integrated multidisciplinary team of more than 30 scientists from

- pure and applied mathematics
- immunology
- physics
- midwifery
- complexity theory
- cell and molecular biology
- computer science
- pharmacology
- engineering
- medicine

- develop and apply integrative *computational-experimental approaches*
- provide fundamental insights of *life beyond physics*
- enable prediction, prevention and treatment of *diseases*



“Welcome to the Era of Cognitive Health”

Cognitive computing

IBM Watson Health is pioneering **a new partnership between humanity and technology** with the goal of transforming global health. Cognitive systems that understand, reason and learn are helping people expand their knowledge base, improve their productivity and deepen their expertise.

With **cognitive computing**, we are now able to see health data that was previously hidden, and do more than we ever thought possible.

The Data Explosion

Medical data is expected to double every 73 days by 2020.

The Great Unknown

80% of health data is invisible to current systems because it's unstructured. Watson Health can see it.

A Quick Study

Watson can read 40 million documents in 15 seconds.

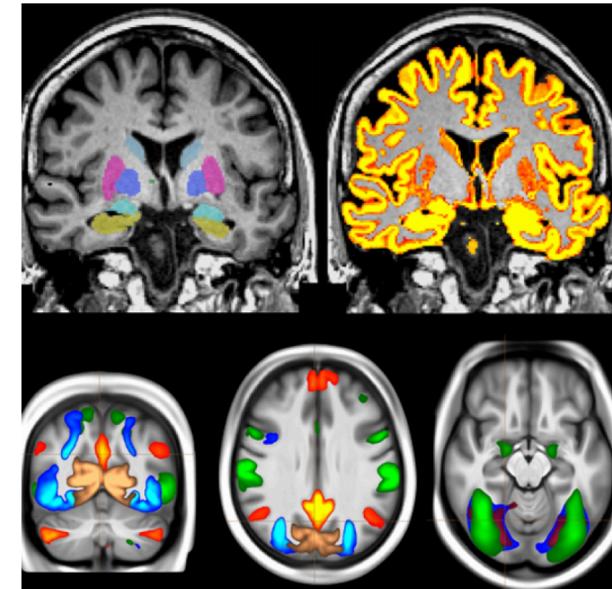
Broad Consensus

81% of healthcare executives familiar with Watson Health believe it will positively impact their business.

First brain scans available from world's largest imaging study

N = 100 000

Five thousand brain scans from the UK Biobank imaging project are now available for use by the research community.



UK Biobank

<http://www.ukbiobank.ac.uk>

<http://www.nature.com/neuro/journal/vaop/ncurrent/full/nn.4393.html>

Medical imaging has enormous potential for early disease prediction, but is impeded by the difficulty and expense of acquiring data sets before symptom onset.

UK Biobank aims to address this problem directly by acquiring high-quality, consistently acquired imaging data from 100,000 predominantly healthy participants, with health outcomes being tracked over the coming decades.

The brain imaging includes structural, diffusion and functional modalities. Along with body and cardiac imaging, genetics, lifestyle measures, biological phenotyping and health records, this imaging is expected to enable discovery of imaging markers of a broad range of diseases at their earliest stages, as well as provide unique insight into disease mechanisms.

We describe UK Biobank brain imaging and present results derived from the first 5,000 participants' data release. Although this covers just 5% of the ultimate cohort, it has already yielded a rich range of associations between brain imaging and other measures collected by UK Biobank.

computationalmedicine.no

Computational medicine supported by UH-Nett Vest

LOG IN

Projects

[Kidney](#)
[Brain connectivity](#)
[ML and cancer](#)
[BHCS](#)
[Cell segmentation](#)
[Larynx simulation](#)
[Extra: Kiwi segmentation](#)

Workshop

[Workshop at HiB, January 2016](#)
 UiB, IRIS, HiB

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Projects

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Poliklinikk

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Computational medicine: Numerical models for medical images and signals

The research program aims to create and promote collaborations between researchers at Bergen University College, Haukeland University Hospital, the University of Bergen and the University of Stavanger, within the field of **computational medicine** and **biomedical engineering**, focusing on image data and clinical applications.

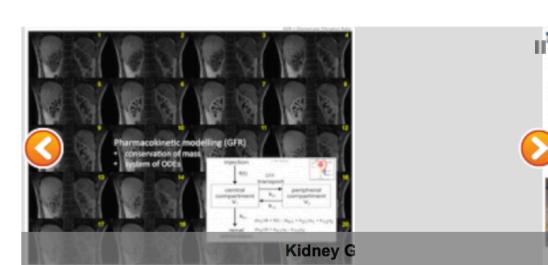
We are currently pursuing four main topics of research: (i) MRI-based biomarkers for the prediction of kidney functions, (ii) Brain networks in health and disease, (iii) Multiparametric MRI and machine learning in cancer diagnosis and monitoring, and (iv) The Bergen hip-cohort study—Big data and analysis of longitudinal phenotypes. Details can be found in the individual project pages.

The activities are anchored in several established research programs, in particular [MedViz](#) and [ICT Engineering](#).

MedViz is a research & development cluster based in Bergen, performing interdisciplinary research in advanced image analysis and visualisation. ICT Engineering is a strategic research program at Bergen University College, consisting of six research groups: Model-driven software engineering, engineering computing, computational intelligence, grid computing and physics data analysis, secure and reliable communication, and communication systems and sensor networks.

Supported by [UH-Nett Vest](#). The project application (in Norwegian) can be found here:

[UH-Nett-søknad](#)



Reproducible research – Open Science – Open source

Computational medicine
& Software development

GitHub

From Wikipedia, the free encyclopedia

GitHub is a web-based [Git](#) repository hosting service. It offers all of the [distributed revision control](#) and [source code management](#) (SCM) functionality of [Git](#) as well as adding its own features. Unlike [Git](#), which is strictly a [command-line](#) tool, GitHub provides a [Web-based graphical interface](#) and desktop as well as mobile integration. It also provides [access control](#) and several collaboration features such as [bug tracking](#), [feature requests](#), [task management](#), and [wikis](#) for every project.^[3]

GitHub offers both plans for private [repositories](#) and free accounts,^[4] which are usually used to host [open-source](#) software projects.^[5] As of April 2016, GitHub reports having more than 14 million users and more than 35 million repositories,^[6] making it the largest host of source code in the world.^[7]

"Build software better, together"

README.md



Example

The [Medical Imaging Interaction Toolkit](#) (MITK) is a free open-source software system for development of interactive medical image processing software. MITK combines the [Insight Toolkit](#) (ITK) and the [Visualization Toolkit](#) (VTK) with an application framework.

The links below provide high-level and reference documentation targeting different usage scenarios:

- Get a [high-level overview](#) about MITK with pointers to further documentation
- End-users looking for help with MITK applications should read the [MITK User Manual](#)
- Developers contributing to or using MITK, please see the [MITK Developer Manual](#) as well as the [MITK API Reference](#)

See the [MITK homepage](#) for details.

Supported Platforms

MITK is a cross-platform C++ toolkit and officially supports:

- Windows
- MacOS X
- Linux

For details, please read the [Supported Platforms](#) page.

License

Copyright (c) [German Cancer Research Center](#).

MITK is available as free open-source software under a [BSD-style license](#).

Download

Data analytics - Machine learning

IEEE TRANSACTIONS ON MEDICAL IMAGING

A PUBLICATION OF
THE IEEE ENGINEERING IN MEDICINE AND BIOLOGY SOCIETY
THE IEEE NUCLEAR AND PLASMA SCIENCES SOCIETY
THE IEEE SIGNAL PROCESSING SOCIETY
THE IEEE ULTRASONICS, FERROELECTRICS, AND FREQUENCY CONTROL SOCIETY

MAY 2016

VOLUME 35

NUMBER 5

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Deep learning is a growing trend in general data analysis and has been termed one of the 10 breakthrough technologies of 2013 [1]. Deep learning is an improvement of artificial neural networks, consisting of more layers that permit higher levels of abstraction and improved predictions from data [2]. To date, it is emerging as the leading machine-learning tool in the general imaging and computer vision domains.

SPECIAL ISSUE ON DEEP LEARNING IN MEDICAL IMAGING

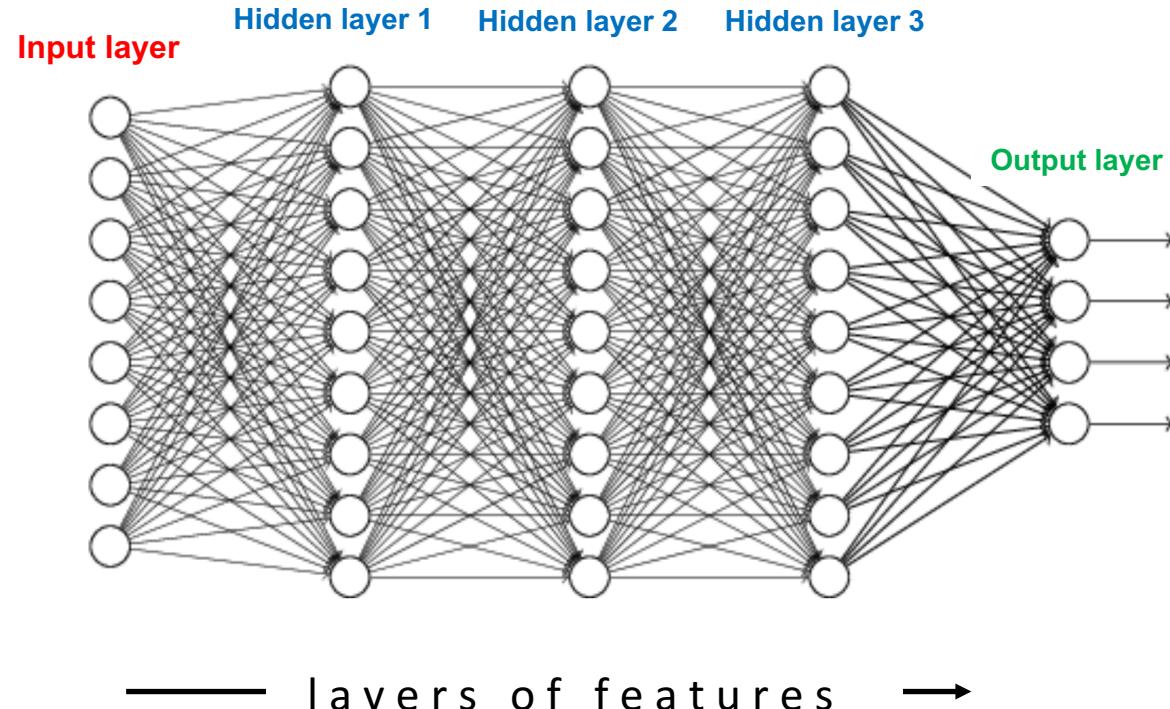
GUEST EDITORIAL

- Deep Learning in Medical Imaging: Overview and Future Promise of an Exciting New Technique *H. Greenspan, B. van Ginneken, and R. M. Summers* 1153

SPECIAL ISSUE PAPERS

- Pulmonary Nodule Detection in CT Images: False Positive Reduction Using Multi-View Convolutional Networks *A. A. A. Setio, F. Ciompi, G. Litjens, P. Gerke, C. Jacobs, S. J. van Riel, M. M. W. Wille, M. Naqibullah, C. I. Sánchez, and B. van Ginneken* 1160
- Improving Computer-Aided Detection Using Convolutional Neural Networks and Random View Aggregation *H. R. Roth, L. Lu, J. Liu, J. Yao, A. Seff, K. Cherry, L. Kim, and R. M. Summers* 1170
- Automatic Detection of Cerebral Microbleeds From MR Images via 3D Convolutional Neural Networks *Q. Dou, H. Chen, L. Yu, L. Zhao, J. Qin, D. Wang, V. C. Mok, L. Shi, and P.-A. Heng* 1182
- Locality Sensitive Deep Learning for Detection and Classification of Nuclei in Routine Colon Cancer Histology Images .. *K. Sirinukunwattana, S. E. A. Raza, Y.-W. Tsang, D. R. J. Snead, I. A. Cree, and N. M. Rajpoot* 1196
- Lung Pattern Classification for Interstitial Lung Diseases Using a Deep Convolutional Neural Network *M. Anthimopoulos, S. Christodoulidis, L. Ebner, A. Christe, and S. Mougiakakou* 1207
- Marginal Space Deep Learning: Efficient Architecture for Volumetric Image Parsing *F. C. Ghesu, E. Krubasik, B. Georgescu, V. Singh, Y. Zheng, J. Hornegger, and D. Comaniciu* 1217
- Deep 3D Convolutional Encoder Networks With Shortcuts for Multiscale Feature Integration Applied to Multiple Sclerosis Lesion Segmentation *T. Brosch, L. Y. W. Tang, Y. Yoo, D. K. B. Li, A. Traboulsi, and R. Tam* 1229

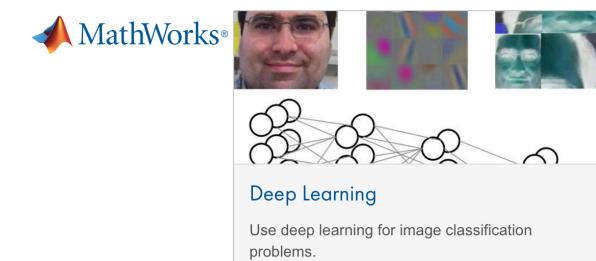
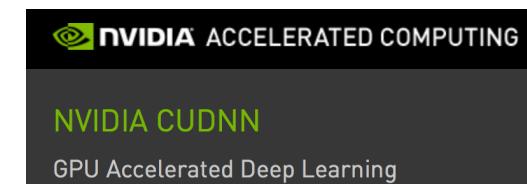
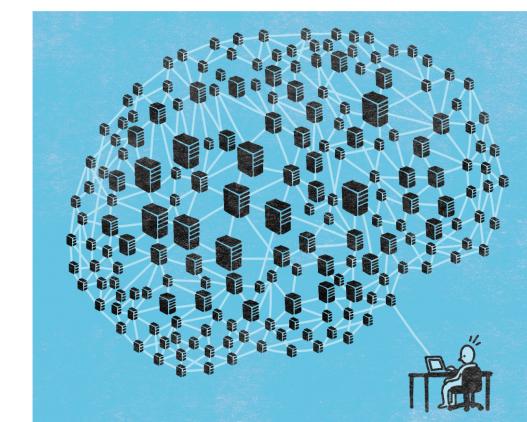
Neural networks - deep learning



Deep learning is a branch of machine **learning** based on a set of algorithms that attempt to model high-level abstractions in data by using multiple processing layers, with complex structures or otherwise, composed of multiple non-linear transformations

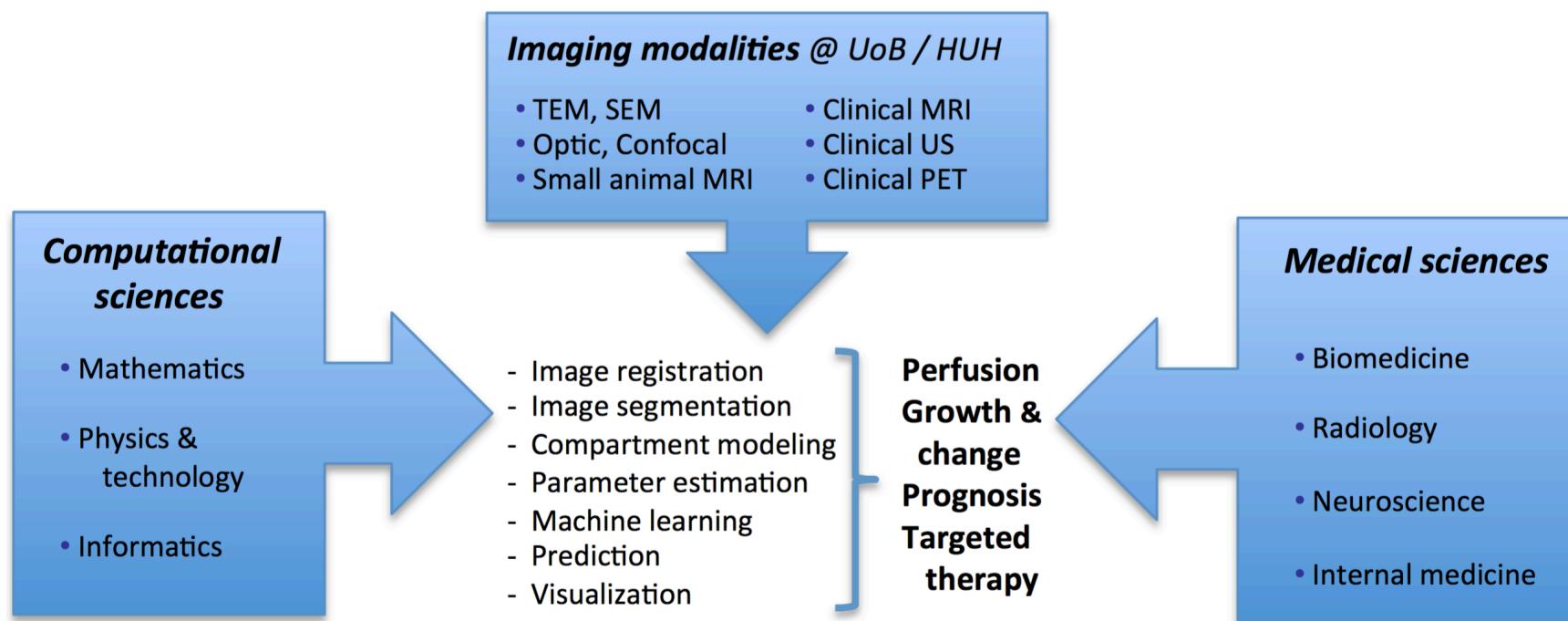
Wikipedia

Microsoft releases CNTK, its open source deep learning toolkit, on GitHub



SFF PROPOSAL ~~2013-2022~~

Imaging-based Computational Medicine - from Vision to Decision



Scientific leadership team

Mathematical imaging: Prof. Antonella Zanna Munthe-Kaas

Dept. of Mathematics, Univ. of Bergen

Physics and radiology: Assoc. Prof. Renate Grüner

Dept. of Radiology & Dept. of Physics and Technology, Univ. of Bergen

Biomedical visualization: Prof. Helwig Hauser

Dept. of Informatics, Univ. of Bergen

Translational imaging (neuro-oncology): Prof. Frits Thorsen

Dept. of Biomedicine / Molecular Imaging Center, Univ. of Bergen

Radiological applications (kidney): Prof. Jarle Rørvik

Dept. Surgical Sciences, Univ. of Bergen & Dept. of Radiology, Haukeland Univ. Hospital

Cognitive neuroscience: Prof. Kenneth Hugdahl

Dept. of Biological & Medical Psychology, Univ. of Bergen

Clinical applications (brain): Prof. Lars Thomassen

Dept. of Neurology & Dept. of Clinical Medicine, Univ. of Bergen

Clinical and translational applications (abdominal): Prof. Bjørn Tore Gjertsen

Institute of Medicine, Univ. of Bergen & Dept. of Medicine, Haukeland Univ. Hospital

Bergen-based collaboration

- HiB
(matematikk/data/helse)
- Uni Research Computing
(Center for Big Data Analysis)
- CMR
- IRIS
- NordicNeuroLab

Interdisciplinary collaboration



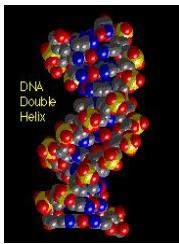
FROM VISION TO DECISION

Matrix coupling between the MethWPs and the ClinWPs

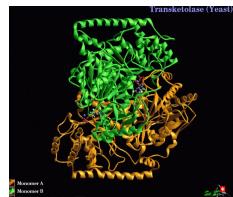
Imaging-based Computational ↓ Medicine → in the MedViz CoE	ClinWP1 <i>Brain: normal appearing tissue</i>	ClinWP2 <i>Brain: lesions and image-guided therapy</i>	ClinWP3 <i>Abdomen: organ function assessment</i>	ClinWP4 <i>Abdomen: lesions and image-guided therapy</i>
MethWP1 <i>Image registration and classification</i>	Meth: Registration in time, segmentation Clin: Finding key biomarkers	Meth: Multimodal registration of lesions, Tissue characterization Clin: Longitudinal biomarkers	Meth: Registration of physiology in time; time-course segmentation Clin: Classification of healthy and at risk tissue	Meth: Registration in real-time Clin: Classification of inflammation vs. neoplasms
MethWP2 <i>Compartment modeling</i>	Meth: Time series, tracer kinetics Clin: Brain function microvasculature	Meth: Modeling in presence of pathology Clin: Angiogenesis permeability	Meth: Single and multi-Channel AIFs Clin: Voxel-wise GFR, RPF	Meth: Contrast and micro-bubbles Clin: Blood flow, inflammation, drug delivery
MethWP3 <i>Machine learning and prediction</i>	Meth: Feature extraction: micro & macro, Graph metrics Clin: Grouping subjects and tissues	Meth: Feature extraction: texture and macro features Clin: Grouping subjects and tissues	Meth: Pattern recognition micro, physiol. params. Clin: Grouping subjects and tissues; Prognostics	Meth: Pattern recognition macro Clin: Grouping subjects and tissue states
MethWP4 <i>Multidimensional visualization</i>	Meth: Multimodal visualization and brain connectivity Clin: Highlighting	Meth: Visualization (patho)physiology/ morphology Clin: Decision making	Meth: Quantitative data visualization (confidence) Clin: Set value limits for normal / abnormal	Meth: Feature-based medical visualization Clin: Localizing lesions and therapeutic agent

Imaging infrastructure at HUH and MIC

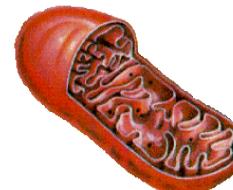
DNA



Protein



Organelle



Cell



Microscopy

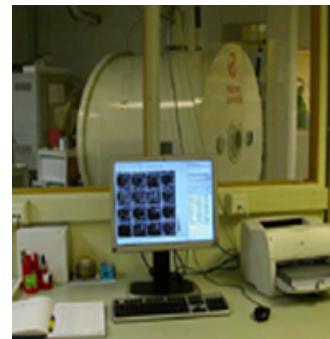
EM



Confocal

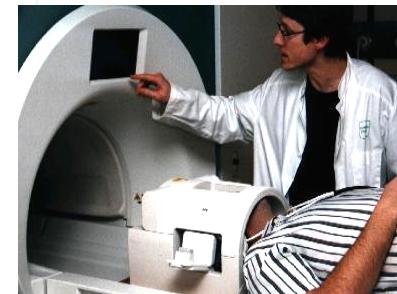


Animal MRI



- Superresolution microscopy (STED)
- MRI expert (acquisition + analysis)

Clinical MRI

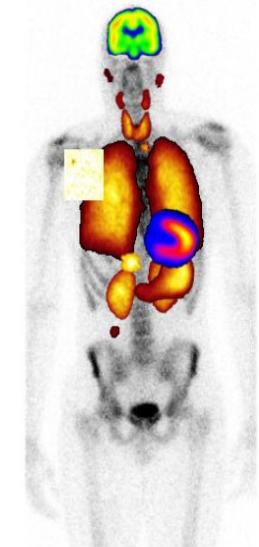


- New visualization center from 2017

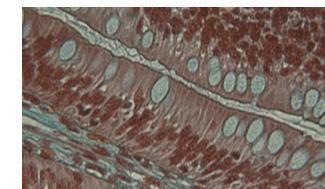
Clinical US



Clinical PET/CT



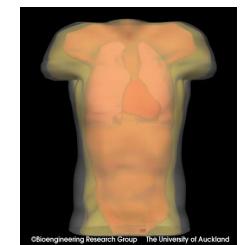
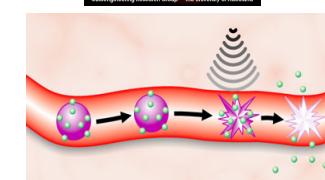
Tissue



Organ



Organism



$$\frac{\partial M_x(t)}{\partial t} = \gamma(\mathbf{M}(t) \times \mathbf{B}(t))_x - \frac{M_x(t)}{T_2}$$

$$\frac{\partial M_y(t)}{\partial t} = \gamma(\mathbf{M}(t) \times \mathbf{B}(t))_y - \frac{M_y(t)}{T_2}$$

$$\frac{\partial M_z(t)}{\partial t} = \gamma(\mathbf{M}(t) \times \mathbf{B}(t))_z - \frac{M_z(t) - M_0}{T_1}$$

Selected research project proposals



FROM VISION TO DECISION

“NeuroAGE”

- Centre for research into age-related neurodegenerative diseases

SFF-application
Prof. Laurence Bindoff /
Prof. Aurora Martinez

“Gut Feelings”

- The brain-gut-microbiota interaction: role in functional gastrointestinal disorders

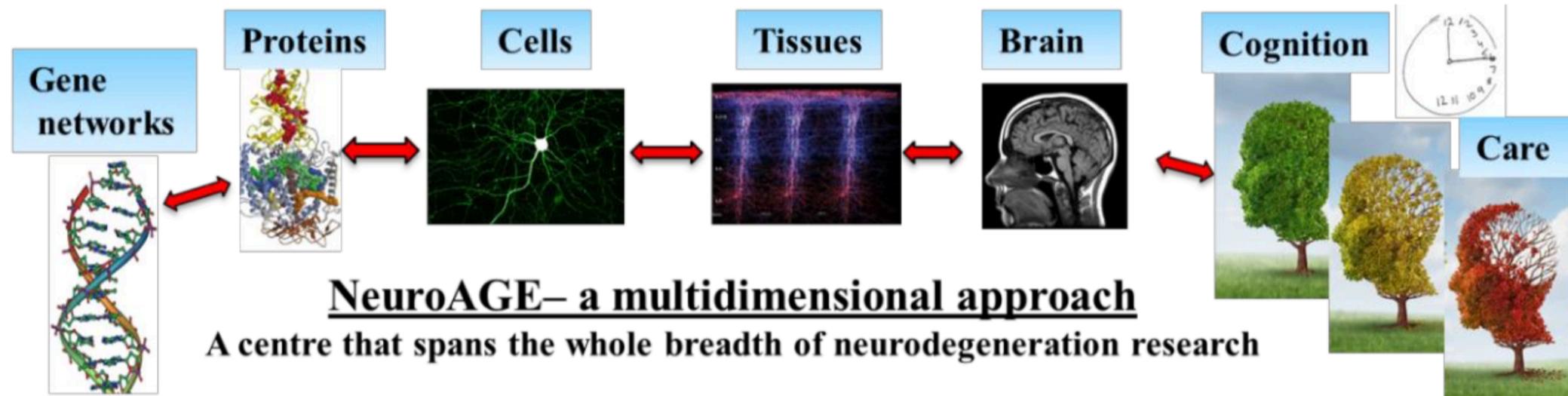
NFR FRIMEDBIO
Prof. Trygve Hausken

“From geophysics to cancer”

- Imaging-based modeling and in-vivo estimation of interstitial fluid flow in cancer

Norwegian Cancer Society
Prof. Antonella Z Munthe-Kaas / IRIS

NeuroAGE - Centre for research into age-related neurodegenerative diseases



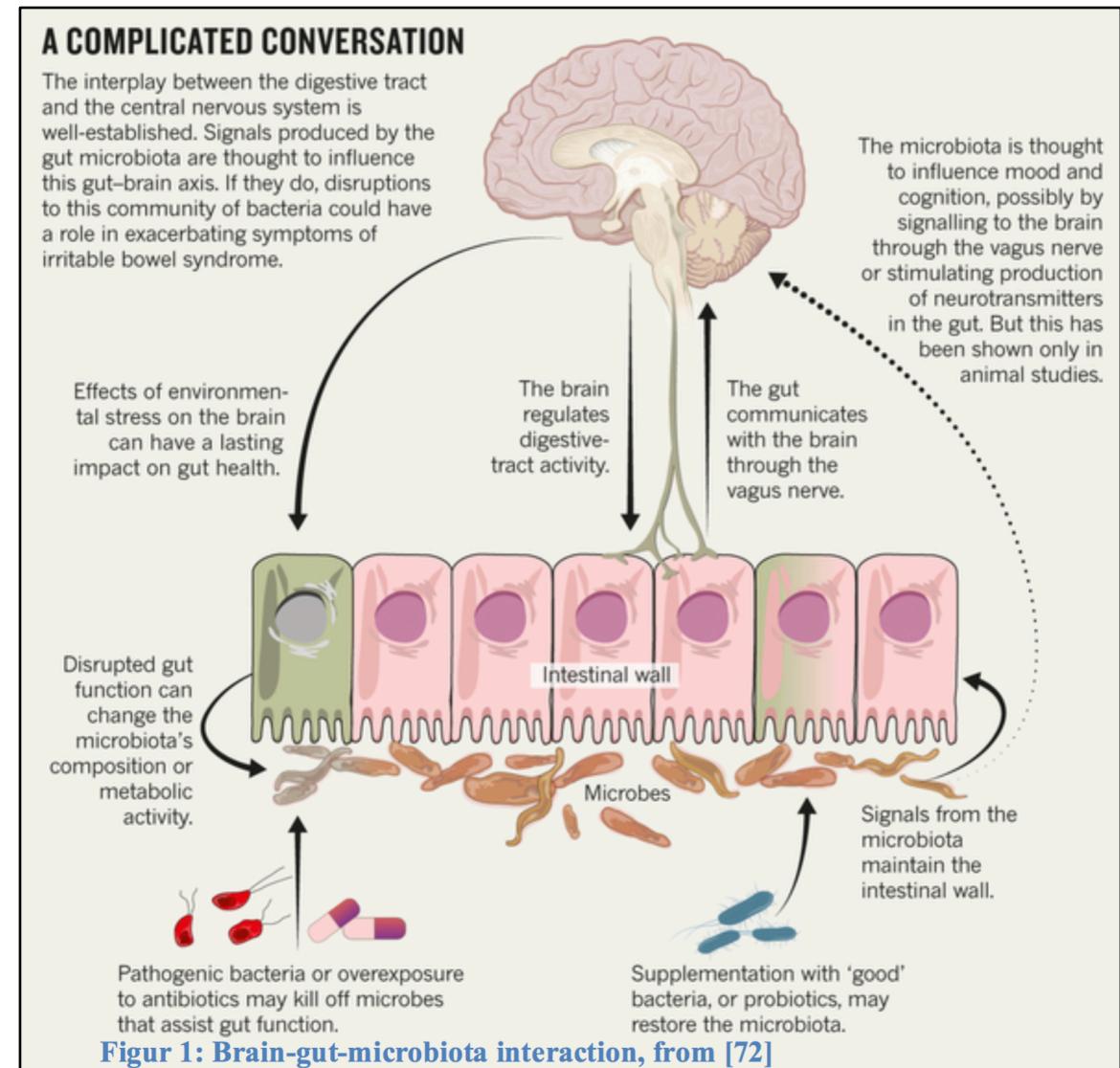
Vision

NeuroAGE will develop a radical new, cross-disciplinary approach to integrates **i) reductionist** analysis of disease mechanisms using novel and more relevant models with **ii) integrative systems biology** studies using state of the art computational neuroimaging and high throughput sequencing to identify new and more specific biomarkers and **iii) healthcare studies** informed by patients, families and healthcare workers focussed across the whole spectrum from earlier diagnosis to end-of-life care.

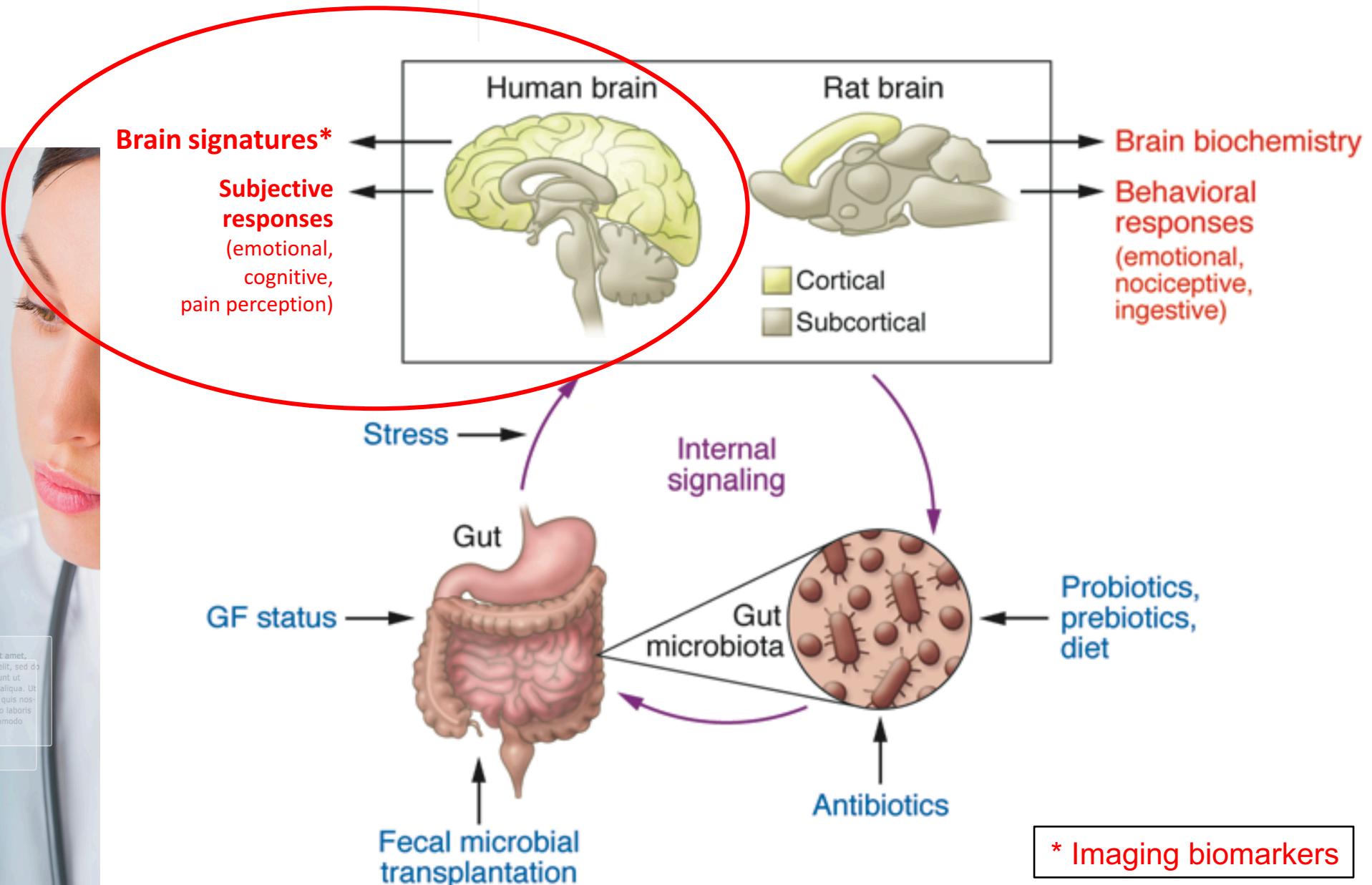
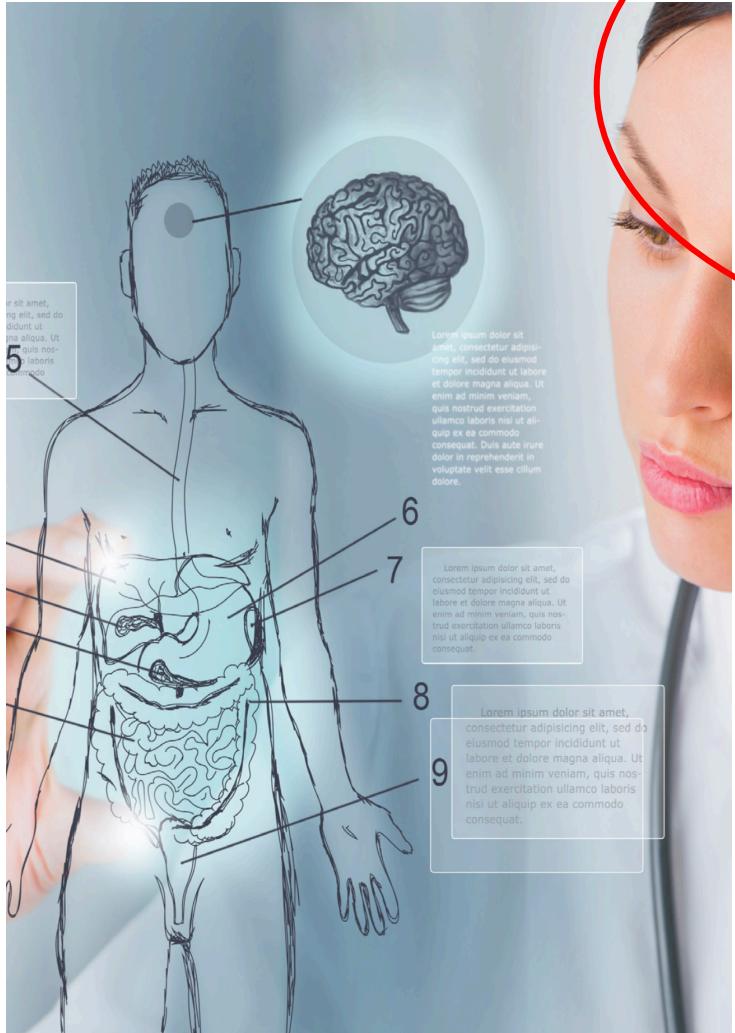
Gut Feelings: Brain-gut-microbiota interaction in functional gastrointestinal disorders

Project manager: Trygve Hausken

Collaborators: Arvid Lundervold, Jan G. Hatlebakk, Odd Helge Gilja, Robin Spiller, Michael Horowitz, Karen L Jones, Beate Niesler, Magdy El Salhy, Astri J.Lundervold, Synne Ystad, Jørgen Valeur, Harald Wiker, Dag Arne Hoff, Gülen Arslan Lied, Tarek Mazzavi, Eivind Valestrand, Kiniena F Tekie, Lionel Giriteka.



The Brain-Gut axis and the irritable bowel syndrome (IBS)





APPLICATION INFORMATION

Application ID	182534
Call	Open Call 2016
Applicant	Antonella Zanna Munthe-Kaas
Project Manager	Antonella Zanna Munthe-Kaas

Imaging-based modeling and in-vivo estimation of interstitial fluid flow in cancer

Overall aims

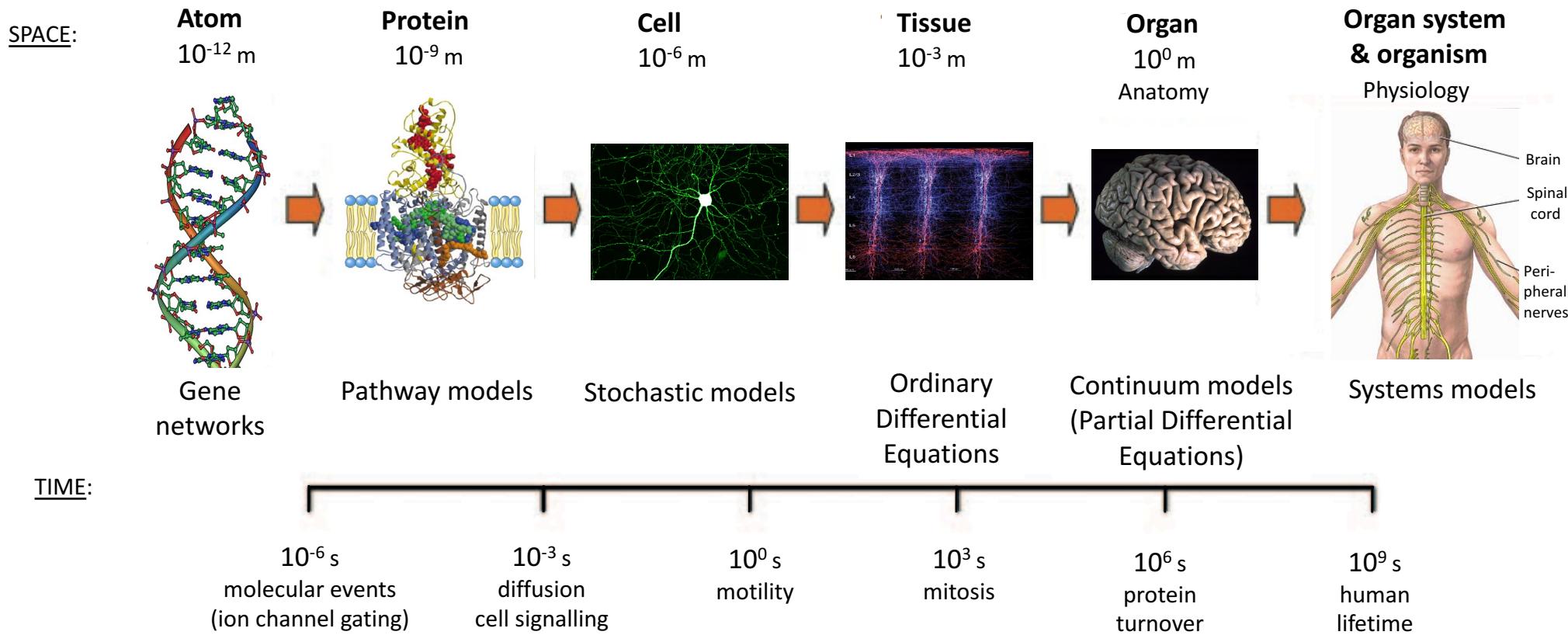
The main goal is to develop key technologies to enable measurements of interstitial fluid flow in cancerous tissue using dynamic magnetic resonance image acquisitions (DCE-MRI) combined with mathematical modeling and data assimilation, a workflow that has been successful in the geosciences. Expected outcome is a quantitative tool for in-vivo monitoring of disease progression and assessment of therapeutic drug delivery in cancer. The current project has a special focus on method development having access to data from a large collection of patients with prostate cancer including joint DCE-MRI recordings and histological verification. The modeling and software implementation will have a core component that is generic, and will also be tested and adopted to cancer in other organs (kidney, brain).

The future of medicine ...



- mindset
- skillset
- toolset
- open science
- reproducible research

- **SYSTEMS BIOLOGY , SYSTEMS MEDICINE and COGNITIVE HEALTHCARE**
- **INTERDISCIPLINARITY and COMPUTATIONAL APPROACHES**
addressing the multi-scale nature of organs and tissues in health and disease



Biomedical Network

- *The aim is to establish a common platform for innovation and project development across academic and between public and private actors.*

→ Collaborative projects in “Computational medicine”, e.g.

? APPLICATIONS

- Imaging-based biomarkers
- Aging and neurodegeneration
- Brain-Gut-Microbiota interaction
- Kidney function

? METHODS

- Computational imaging
- Machine learning
- Predictive modelling
- Visual analytics