

# Introduction to biomedical data

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MERJA HEINÄNIEMI

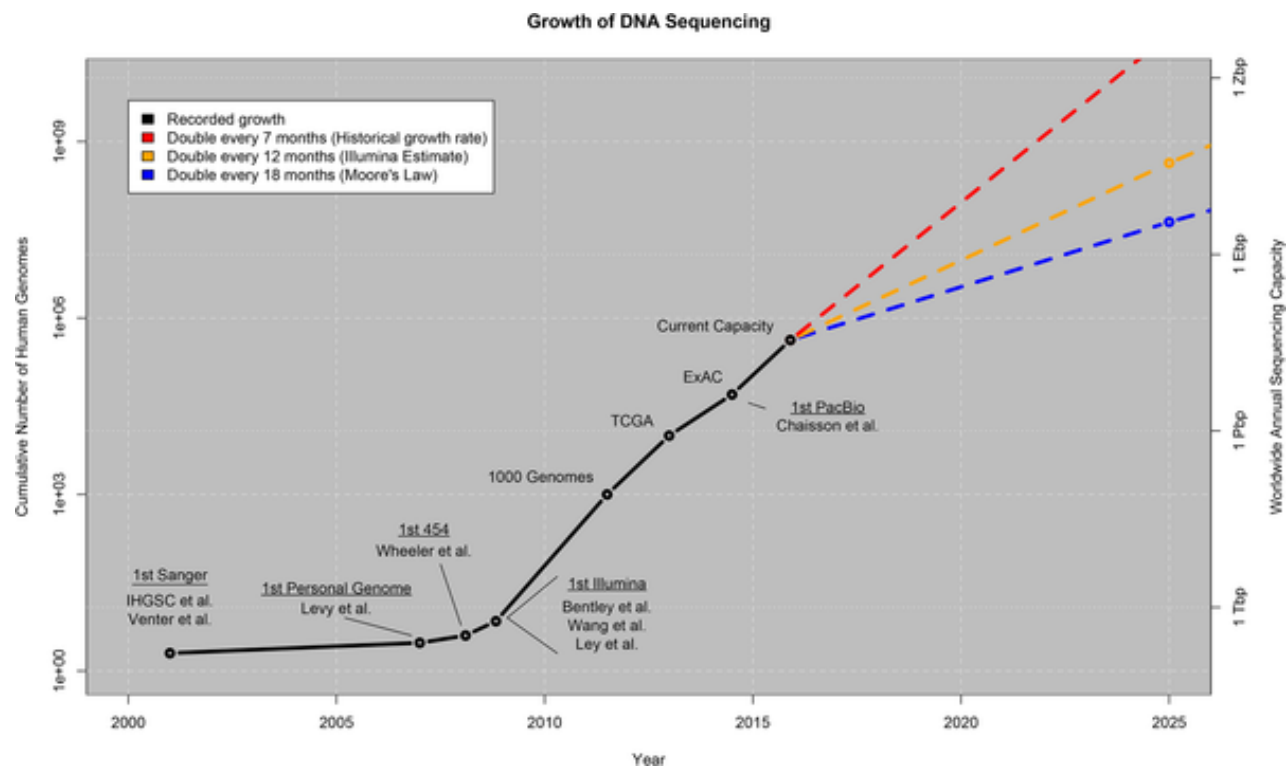
ASSOCIATE PROFESSOR IN BIOINFORMATICS

INSTITUTE OF BIOMEDICINE, SCHOOL OF MEDICINE



UNIVERSITY OF  
EASTERN FINLAND

# New challenges that bring us together



Stephens ZD, Lee SY, Faghri F, Campbell RH, Zhai C, et al. (2015) Big Data: Astronomical or Genomical?. PLoS Biol 13(7): e1002195. doi:10.1371/journal.pbio.1002195

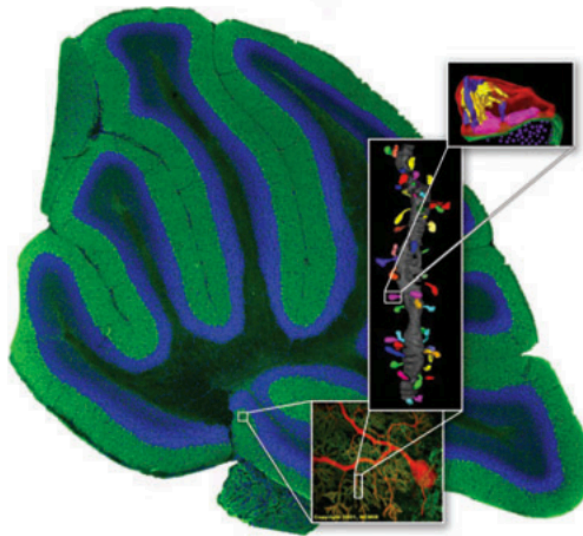




# Big data in biomedicine

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**Imaging** digital pathology, video recordings, integrating across imaging modalities



# Big data in biomedicine

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**Health** electronic medical records, pharmacy prescription information, insurance records



# Personal recordings

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**Mole Mapper** uses the phone's camera to track moles based on measurement, location and monitoring over time - **melanoma**

**The Parkinson's app** takes advantage of the phone's microphone, gyroscope and accelerometer to collect and track health and symptoms

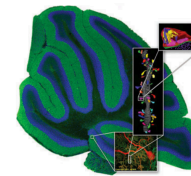
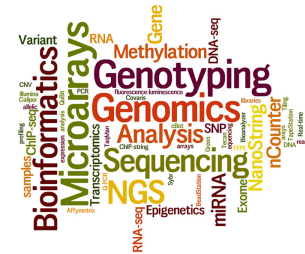
Other patient-driven communities include <https://www.patientslikeme.com>



*Collaborating with the UEF  
summer school to arrange  
the challenge for 2nd week*

# Big data in biomedicine

- Genomics data matrices: ***long & thin***  
10<sup>4</sup> to 10<sup>6</sup> variables ; 10 to 10<sup>2</sup> patients
- Health record data matrices: ***short & broad***  
10 to 10<sup>2</sup> variables ; 10<sup>4</sup> to 10<sup>6</sup> patients
- Biomedical images:  
high-resolution digital images and movies



**Future challenges**  
Modeling these  
together

# Bioinfo track lectures: molecular data

Wednesday
Introduction to biomedical data - Merja Heinäniemi
Cell type deconvolution problem, Petri Pölönen
Lunch
Unsupervised dimensionality reduction, Juha Mehtonen
Multiview dimensionality reduction, Robert Ciszek + Break
Deep neural network applications, overview, Merja Heinäniemi
Deep neural network configurations for DNA motif analysis, Juha Mehtonen

## Learning objectives

### Domain knowledge

Basic molecular biology

### Data types

RNA-sequencing and other omics data

### ML applications

Unsupervised: dimensionality reduction  
Supervised: deep neural networks

***In preparation of 2nd week***   *Cell type deconvolution problem*



# Bioinfo track lectures: imaging data

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<http://www.jussitohka.net>

## Learning objectives

**Domain knowledge**

Imaging modalities

**Data types**

MRI, tissue sections

**ML applications**

Mainly supervised methods



***+ Integrating molecular and imaging data in multiscale models***

<http://www.cs.tut.fi/~ruusuvuo/>

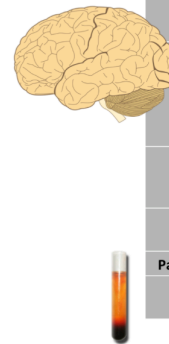
# Bioinfo track independent assignment

You will analyze and model data generated by AMPAD-AD, *the Accelerating Medicines Partnership-Alzheimer's Disease*

**Scientific hypothesis:** neuro-degenerative diseases such as Alzheimer's disease affect the different brain cell types, resulting e.g. in neuronal loss in certain brain regions

**Question:** Which cell types are up-, down-regulated or unchanged in AD?

Human Tissue



HUMAN TISSUE	Diagnosis	Assay
Prefrontal Cortex	<ul style="list-style-type: none"><li>Alzheimer's Disease</li><li>Mild Cognitive Impairment</li><li>Parkinson's Disease</li><li>Amyotrophic Lateral Sclerosis</li><li>Corticobasal Degeneration</li><li>Frontotemporal Dementia</li><li>Dementia with Lewy Bodies</li></ul>	<ul style="list-style-type: none"><li>RNAseq</li><li>Gene Expression array</li><li>miRNA array</li><li>ChIPseq</li><li>DNA Methylation array</li><li>Proteomics</li><li>Confocal Imaging</li><li>SNP genotypes</li><li>Proteomics</li><li>Whole Exome Seq</li></ul>
Visual Cortex	<ul style="list-style-type: none"><li>Alzheimer's Disease</li></ul>	<ul style="list-style-type: none"><li>Gene Expression Array</li><li>SNP genotypes</li></ul>
Temporal Cortex	<ul style="list-style-type: none"><li>Alzheimer's Disease</li><li>Progressive Supranuclear Palsy</li><li>Parkinson's Disease</li></ul>	<ul style="list-style-type: none"><li>RNAseq</li><li>SNP genotypes</li></ul>
Cerebellum	<ul style="list-style-type: none"><li>Alzheimer's Disease</li><li>Progressive Supranuclear Palsy</li><li>Parkinson's Disease</li></ul>	<ul style="list-style-type: none"><li>RNAseq</li></ul>
Superiour Temporal Gyrus	<ul style="list-style-type: none"><li>Alzheimer's Disease</li></ul>	<ul style="list-style-type: none"><li>RNAseq</li><li>Whole Exome Seq</li></ul>
Parahippocampal Gyrus	<ul style="list-style-type: none"><li>Alzheimer's Disease</li></ul>	<ul style="list-style-type: none"><li>RNAseq</li></ul>
Serum	<ul style="list-style-type: none"><li>Alzheimer's Disease</li><li>Mild Cognitive Impairment</li></ul>	<ul style="list-style-type: none"><li>Metabolomics</li></ul>

**Data:** RNA-sequencing from postmortem tissue samples collected across 7 different brain regions  
+ Associated metadata (clinical and technical)

# Bioinfo track independent assignment

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*We can distinguish different cell types from measuring RNA levels **or** from tissue images*

**The problem:** tissue samples represent the average RNA level profile across all cells (and cell types) – these are called bulk measurements

# Bioinfo track independent assignment (1)

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**Molecular data** *New type of data is now available: single cell RNA-sequencing (scRNAseq)*

**The aim** is to predict the proportion of different cell types from bulk RNASeq using clever approach utilizing data from single cell RNASeq -> cell type deconvolution problem

*Challenge: Can you come up with a clever way to utilize scRNAseq to deconvolve the signal in the Alzheimer brain tissue samples?*

# Bioinfo track independent assignment (2)

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**Imaging data** Brain imaging data is available: Allen Brain Atlas in situ hybridization

**The aim** is to perform automated image annotation to find out which cell types / tissue sub-structures express the genes that change their level in Alzheimer's disease patients (RNA-seq profiles)

*Challenge: Can you come up with a clever way to utilize  
Allen Brain Atlas data to link the gene expression  
changes in the Alzheimer brain to specific brain regions?*

# Bioinfo track independent assignments

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**Choose one** of the proposed tasks (molecular data / imaging data)

Evaluation will be based on:

- clever choice of methodology
- clever use of data

Demonstrating preliminary success will not be a requirement to pass the course but used to set up a leader board. You can expect that your approach should be able to detect neuronal loss in Alzheimer's disease in the cortex.