









# **Advanced Bioinformatics Workshop**

**Date**: Monday, August 19<sup>th</sup> – Friday, August 23<sup>rd</sup>, 2019 **Venue**: Adriatico Guest House - Denardo Lecture Hall International Centre for Theoretical Physics

Trieste, Italy

Course URL: <a href="http://indico.ictp.it/event/8847/">http://indico.ictp.it/event/8847/</a>

Material: <a href="https://codata-rda-advanced-bioinformatics-2019.readthedocs.io">https://codata-rda-advanced-bioinformatics-2019.readthedocs.io</a>

## General theme

Building Machine Learning workflows using NGS Data

This advanced bioinformatics course will provide an overview of the current status of different NGS workflows (variant calling, RNA-Seq, ChIP-Seq, Metagenomics etc), and combine them with the appropriate Machine Learning and Data Mining approaches. The course will heavily rely on hand-on exercises and tutorials, and attempt to provide a strong foundation on the underlying theory.

#### Instructors

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#### Course Schedule

	Topic
	Day 1
11:30 - 12:30	Experiments: Design and Analysis
14:00 - 15:00	Components of an Experiment. What is a good experiment design?
15:00 - 16:00	Data Distributions and Multiple Hypotheses Adjustment Methods
16:15 - 18:00	Introduction to basic NGS pipelines
Day 2	
09:00 - 10:00	Introduction to basic NGS pipelines
10:00 - 11:00	Short read quality and trimming (part 1)
11:30 - 12:30	Short read quality and trimming (part 2)
14:00 - 15:00	Mapping











16:15 – 18:00 Variant calling (part 2)  Day 3  09:00 – 10:00 Introduction to DM and ML, Machine Learning basic concepts  10:00 – 11:00 Taxonomy of ML and examples of algorithms  11:30 – 12:30 Applications of ML in Bioinformatics  14:00 – 15:00 Practicing using the built-in R data set iris  15:00 – 16:00 RNASeq analysis using clustering in R  16:15 – 18:00 RNASeq analysis in R to be continued  Day 4  09:00 – 10:00 Introduction to Automation and Nextflow  10:00 – 11:00 Automation  11:30 – 12:30 Nextflow  14:00 – 15:00 Practical exercises in Nextflow	
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Day 5	
09:00 – 10:00 Metagenomics and Machine Learning	
10:00 – 11:00 Correlation and Linear Regression in Life Sciences	
11:30 – 12:30 Closing, Final Remarks, Post-workshop survey	

## **Topics**

- 1. Experiments: Design and Analysis.
  - a. Components of an Experiment.
  - b. What is a good experiment design?
  - c. Batch effects and Confounding factors
  - d. Statistical inference
  - e. Data Distributions and Multiple Hypotheses Adjustment Methods
  - f. Correlation and Linear Regression in Life Sciences
- 2. Introduction to NGS Data Analysis
  - a. Quality Assessment, Trimming and Filtering
  - b. Mapping
  - c. Case studies (e.g. Variant Calling, Metagenomics, etc)
- 3. Introduction to Machine Learning
  - a. Basic concepts
  - b. Taxonomy of ML and examples of algorithms
  - c. Applications of ML in Bioinformatics
- 4. Introduction to Nextflow
  - a. Use of workflow systems for automation / reproducibility
  - b. Basic syntax of Nextflow
  - c. Transform and execute a workflow in Nextflow
- 5. Machine learning in NGS
  - a. RNA-Seq analysis using clustering in R
  - b. Metagenomics and Machine Learning











# **Learning Objectives**

## **Experimental Design**

- Importance of a good experimental design
- Identify the key components of an experimental design
- Understand and identify confounding factors
- Understand p-value, confidence interval and power, including the underlying assumptions
- Understanding of the difference between pearson, spearman and kendall correlation
- Understanding of the underlying assumptions of pearson correlation

# Introduction to NGS data analysis

- Use fastqc and multiqc
- Visualize read quality
- Quality filter and trim reads
- Distinguishing good/bad quality reads
- Run one end-to-end NGS data analysis pipeline

#### **Introduction to Machine Learning**

- Learn Machine Learning basic concepts and jargon
- Understand the Taxonomy of Machine Learning algorithms and differences between basic algorithms categories
- Get familiar with the basic Machine Learning algorithms in supervised and unsupervised learning categories
- Understand different parameters to take into consideration to choose the right
   Machine Learning technique for a given problem
- Understand how to evaluate Machine Learning results in supervised and unsupervised classification

## Machine learning in NGS

Learn about some applications of Machine Learning in Bioinformatics

- Explore and apply some basic R packages to perform supervised and unsupervised classification
- Overview of the different Machine Learning techniques / tools useful in example NGS pipelines (such as RNA-Seq, metagenomics, etc)

#### **Introduction to Nextflow**











- Find and use Nextflow tool definitions online
- Understand how to write Nextflow definitions for command line tools
- Use Docker with Nextflow to provide software dependencies and ensure reproducibility
- Join Nextflow tools into a workflow
- Run Nextflow workflows on local and HPC systems

# **Expected Background**

Overall course aimed for novices (no prior knowledge / expectations in NGS data analysis or Machine learning). However, participants should be somewhat familiar with:

- R (base commands)
- Unix shell (running basic commands)

Participants should ideally bring their own laptops - if that is not a possibility, Desktop PCs will be available during the course. Instructions on software / libraries installation will be provided to all participants prior to the workshop.

## **Course Material**

All material, slides and exercises are available through the following URL (CC-BY-SA license)

https://codata-rda-advanced-bioinformatics-2019.readthedocs.io/en/latest/