







# Challenges and solutions for teaching single-cell omics data analysis

11.10.2022

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CSC – Suomalainen tutkimuksen, koulutuksen, kulttuurin ja julkishallinnon ICT-osaamiskeskus

### **Outline**



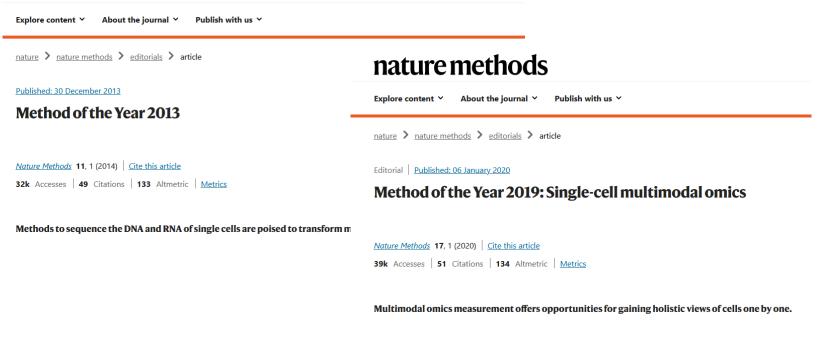
- Challenges
- International collaboration
  - o GOBLET-ELIXIR workshop for single-cell RNA-seq data analysis trainers
  - o ELIXIR Single-cell Omics Community joining forces in Europe and beyond
- National training efforts in Finland
  - Flipped classroom approach
  - eLearning

# **Single-cell omics**



- Multiple technologies able to profile cells for different modalities at a single-cell level • Spatially resolved transcriptomics provides location information too!
- Great for studying development, tissue heterogeneity, disease pathogenesis, etc

#### nature methods



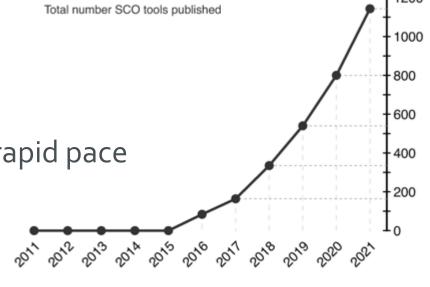
#### nature methods

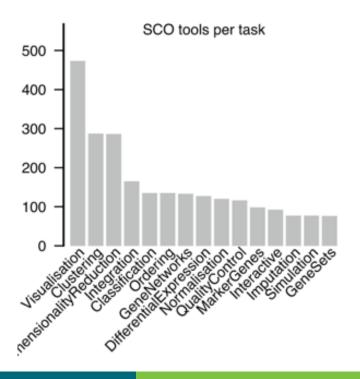


# Challenge

• New single-cell omics technologies are developed at a rapid pace

- They produce different types of data
- New analysis methods and data standards are needed
- Data analysis methods are mushrooming
  - Multi-step analysis, every step has several methods available
  - O How to keep up and choose the best?
- Huge demand for training







# Teaching single-cell omics data analysis is a headache for trainers

- Fast moving field: what should you teach?
- Complex theory: how do you teach it to biologists?
- Several frameworks and complex objects (Scanpy, Seurat, Bioconductor)
- Environment: everybody should have the same packages and enough memory
- Exercise data: needs to show many things (e.g. batch effect removal), yet fast to run

# ...and for participants



Uniform Manifold Approximation and Projection (UMAP)

Pearson residuals from regularized negative binomial regression

t-distributed stochastic neighbor embedding (t-SNE)

Graph-based clustering using SNN, optimize modularity with Louvain algorithm

Canonical correlation analysis (CCA), L2 normalization of CCVs

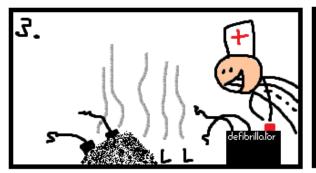
Dynamic time warping

Identify mutual nearest neighbours (MMNs), score anchors in PC space

Drawing by Stefan Rua











# Workshop for single-cell RNA-seq data analysis trainers

- Co-organized by GOBLET and ELIXIR in 30.11.2021
- Brought together over 30 trainers from four continents
- Presentations and discussions on experiences and best practices
- Slides available at https://ssl.eventilla.com/event/xP1QM
- Recorded presentations available as a playlist on GOBLET's YouTube channel ohttps://www.youtube.com/playlist?list=PLN-3-7onnm9WxUY\_7yniEv3hWV1fnBnFm

## Workshop for scRNA-seq data analysis trainers

30.11.2021 13:00 +02:00 EET - 30.11.2021 16:00 +02:00 EET



Single cell RNA sequencing (scRNA-seq) offers great potential, and new experimental technologies and data analysis methods have been developed at rapid pace. However, these fast developments put high pressure on life scientists to keep up with the challenging demands of data analysis, and the need for training is enormous.

This GOBLET-ELIXIR workshop brought together scRNA-seq trainers to share experiences, challenges and best practices. The presentation videos are available in YouTube.

- Welcome, Eija Korpelainen, CSC
- The Swedish efforts in teaching single cell bioinformatics, Paulo Czarnewski (ELIXIR-SE, NBIS, Sweden)
- Flipped classroom approach and Chipster in scRNA-seg training, Eija Korpelainen (ELIXIR-FI, CSC, Finland)
- eLearning in scRNA-seg training, Maria Lehtivaara (ELIXIR-FI, CSC, Finland)
- Galaxy and scRNA-Seq training, Pavankumar Videm (ELIXIR-DE, Galaxy, Germany)
- scRNAseq hands on (Italy, EMBL, Singapore), Raffaele Calogero (ELIXIR-IT, University of Torino, Italy)
- Single-cell RNA seq training in the Netherlands, Ahmed Mahfouz (ELIXIR-NL, LUMC, Netherlands)
- Organizing advanced single-cell courses, Charlotte Soneson (ELIXIR-CH, SIB, Switzerland)
- Single-cell RNA-seg training at Cambridge, Hugo Tavares (ELIXIR-UK, University of Cambridge, UK)

O Event time

Starts: 30.11.2021 13:00 +02:00

Ends: 30.11.2021 16:00 +02:00

Event location

Online



#### Workshop for single cell RNA-seq data analysis trainers 2021

8 videos • 63 views • Last updated on Dec 2, 2021







These presentations were recorded during the GOBLET-ELIXIR workshop for single cell RNA-seq data analysis trainers 30.11.2021. Please see the workshop page

https://ssl.eventilla.com/event/xP1QM for the program and slides.



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#### The Swedish efforts in teaching single cell bioinformatics, Paulo Czarnewski

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#### Flipped classroom approach and Chipster in scRNA-seq training, Eija Korpelainen

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8

#### scrNA-seq training at Single-cell RNA-seq training at Cambridge, Hugo Tavares

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# Ideas from the presentations



- Paulo Czarnewski, NBIS: Problem-based learning
  - o Biological research question given to groups of four people, 5-day course
  - Instructions and glossary with essential information
  - Questions (e.g. why do we normalize data)
  - Groups produce a project report and presentation
- Charlotte Soneson, SIB: Advanced courses, container-based cloud environments
  - Saves course time
  - Access to GPUs too
- Hugo Tavares, University of Cambridge: Online course spread over 3 weeks
  - Google doc for questions
  - O Good training data set!
- Maria Lehtivaara, CSC: eLearning

# **ELIXIR Single-Cell Omics Community**

- People from 19 ELIXIR countries
- F1000 paper describing the goals
  - Training
  - Tool benchmarking
  - Data standards
- SCONE project 2023-2024
  - Single-cell Omics Network for ELIXIR
  - o Training portal inc. lecture videos, datasets, etc

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OPINION ARTICLE



# Community-driven ELIXIR activities in single-cell omics [version 1; peer review: awaiting peer review]

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Tony Burdett7, Barbara Szomolay8, Pavankumar Videm9, Hans-Rudolf Hotz (b) 6,
Irene Papatheodorou (b) 7, John M. Hancock10, Björn Grüning (b) 9, Wilfried Haerty11,
Roland Krause (b) 12, Salvador Capella-Gutierrez (b) 5, Brane Leskošek10, Luca Alessandri3,
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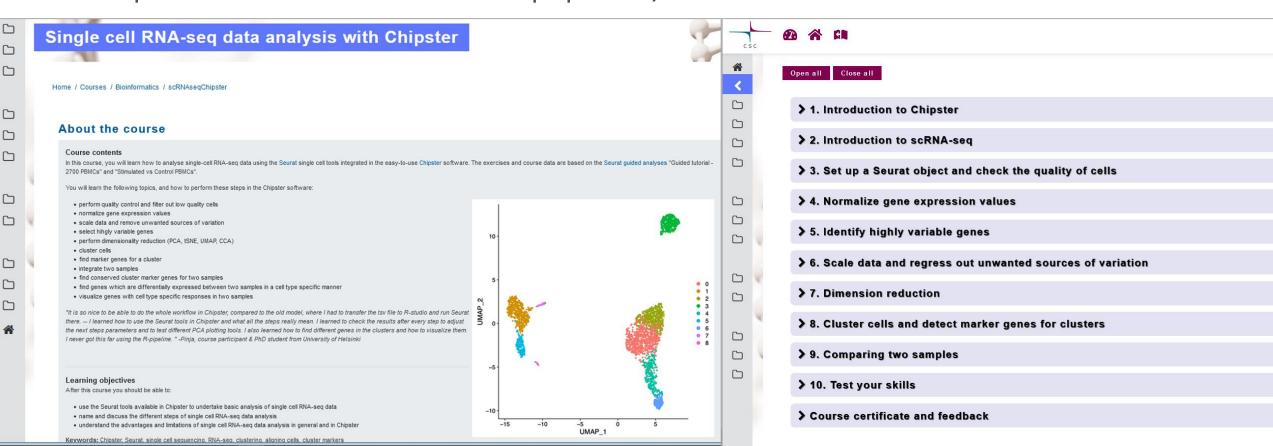
#### **Abstract**

Single-cell omics (SCO) has revolutionized the way and the level of resolution by which life science research is conducted, not only impacting our understanding of fundamental cell biology but also providing novel solutions in cutting-edge medical research. The rapid development of single-cell technologies has been accompanied by the active development of data analysis methods, resulting in a plethora of new analysis tools and strategies every year. Such a rapid development of SCO methods and tools poses several challenges in standardization, benchmarking, computational resources and training. These challenges are in line with the activities of ELIXIR, the European coordinated infrastructure for life science data. Here, we describe the current landscape of and the main challenges in SCO data, and propose the creation of the ELIXIR SCO Community, to coordinate the efforts in order to best serve SCO researchers in Europe and beyond. The Community will build on top of national experiences and pave the way towards integrated long-term solutions for SCO research.

# eLearning course Single-cell RNA-seq data analysis with Chipster



- Focus on data analysis methods
- Lecture videos (beginner and advanced), exercises, quizzes
- https://e-learn.csc.fi/course/view.php?id=17



# Flipped classroom: allows to teach the theory in small doses



- Make short lecture videos on each analysis step
- Give lecture videos to course participants 2 weeks before the course
- Provide a Google doc where people can write questions
- During the course (online or F2F): recap the theory on topic X, exercises on topic X, check the results and discuss, move to topic Y...
- Our experience:
  - o People come to the course well prepared, ask good questions and get more out of the course
  - Course time can be used more efficiently for discussions
- Note: you can use lecture videos by others too!



# **Summary**

- Flipped classroom approach seems to work well
- International collaboration is useful
  - o Let me know if you would like to be involved!
  - Topic for the next workshop: how to teach spatial transcriptomics?