

7BBG1002  
Applied Bioinformatics

## Introduction to the group project

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# Group project – Reproducing published research

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## Aims

- Reproduce the analysis of a published bioinformatics study
- Identify potential problems in the technical and scientific reproducibility
- Critically reflect on your findings

## How it works

- Work collaboratively in groups of 3
- Work on a recent bioinformatics study (published since 2011) using NGS
- Analyse the data from the study starting from the raw data to reproduce the study's findings

# Timeline and support

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## **Introduction session - Today**

Overview of the group project and outline of what is expected

## **Project workshop – 24th November**

Three-hour workshop where you can ask for help and support

## **Submission deadline – 19th December 16:00**

Submit your report on Keats (Hard deadline!)

## **Additional support:**

Post questions on Keats, we or GTAs will try to answer them

# Project basic rules

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## Do

- Reproduce the analysis of a published study that uses NGS technology
- Start your analysis from raw data (you may start from BAM files)
- Follow the methods in the published paper
- Critically reflect on what you are doing, especially when things don't work

## Don't

- Copy analysis code from the original publications
- Use supplementary processed data

## 7BB1002\_groups\_projects\_2025

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# Submission and assessment

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## Assessment outline

Everyone must submit a report by the deadline. You will be assessed individually on the quality of your personal submission. Most of your report can be written as a group, but you will need to add your own personal reflections.

## What your submission must include

1. A scientific report (2000 words and 2+ figures) in article format (i.e. your report must include an introduction, a results, a discussion and a methods section)
2. The code you used for analysis annotated for example with R Markdown. If you use github, make sure the code is provided with the submission document, **not just the link**
3. A reflection on the reproducibility of the research both on a technical and a scientific level (up to 1000 words)
4. A statement of how the work was shared in the group

**Submit these as a single pdf by the deadline.**

# Some pointers for the report

## Scientific report

This should be in the format of a scientific paper (see [here for a guide](#)) and include 2-4 scientific figures on your results with appropriate figure captions. You may use any appropriate layout (for example, journal templates). This part of the assessment and the code annotation should be completed as a group.

You must not copy from the original article, and your write up should focus on the **question of reproducibility**. For example, your introduction may sound like this: "*XYZ, in their 2017 study, concluded that during anaerobic growth, yeast shutdowns its TCA cycle by showing downregulation of TCA cycle genes and upregulation of 28 other genes based on RNA-Seq data. Here, we investigate whether we can reproduce this finding by reanalysing of the data.*"

## Reflection on reproducibility

This part of the submission must be completed individually. You should reflect on two main points:

- a) How easy was the technical replication of the research? (Was the information in the publication sufficient? Did you encounter any technical problems?)
- b) Were you able to reproduce the scientific findings? (Are the findings statistically significant? Are there choices in algorithms that were not detailed in the paper but change the outcome of the analysis?)

# Assessment criteria

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- **Scientific report (60% - 20% for figures, 20% for writing and 20% for content)**

Content: Factual accuracy and understanding of the methodology used and results shown

Figures: Clear and well-annotated figures highlighting key findings (We want to see figures produced by you, not just replicas of what is in the publication – Remember the focus on reproducibility!)

Writing: Clear writing at an academic standard

- **Reflection (20%)**

Insightful commentary on the process of reproducing research results

- **Analysis code and markdown (20%)**

Clear annotations and commentary for using sensible analysis methods following the original methodology, feel free to use Git for this.

# Examples

## Method

### Alignment and assembly

The data retrieved from the RNA-seq in the paper was downloaded from [3]. All the three replicates for each condition (6 h, 14 h and 26 h) were used in the analysis. For the condition 14 h and 26 h the sample from lane 1 was used. Furthermore, the fasta file and the gtf file for the reference genome *Saccharomyces cerevisiae* (*S.cerevisiae*) S288C was retrieved from [4].

First, to be able to use the reference genome, Bowtie2 (included in Tophat) was used to create an index of the reference following the command below. This creates a set of different index files all starting with the same name "genome\_index". It is advised to locate this together with the reference fasta file in the same directory and starting with the same name.

```
bowtie2-build -f reference_genome.fasta genome_index
```

The reads were aligned with TopHat (2.0.14), giving .BAM output files, following the general command below for the explicit code see Appendix.

```
tophat -p number_of_threads -G reference_genome_annotation.gtf/gff -o output_directory  
reference_genome_index_nofileextension forward.fastq reverse.fastq
```

Next the Cufflinks (2.2.1) [5] were used to assemble the individual transcripts into .gtf files with the following general command below, for the explicit code see Appendix.

```
cufflinks -p number_of_threads -o output_directory bamfile_from_tophat.bam
```

The package Cuffmerge in Cufflinks (2.2.1) was then used to assemble all the data to a single comprehensive set of transcript (merged assembly) as a .gtf file. For a general command see below, for the explicit code see Appendix.

```
cuffmerge -g reference_genome_annotation.gtf/gff -s reference_genome.fasta  
-p number_of_threads file_with_paths_to_all_assemblies_from_cufflinks.txt
```

### Differential expression analysis

With the final transcriptome assembly the package Cuffdiff [6] in Cufflinks (2.2.1) was used to retrieve results from statistical analysis for the three conditions. Cuffdiff was used by the general command below, for the explicit code see Appendix.

```
cuffdiff -o output_directory -b reference_genome.fasta -p number_of_threads  
-L Label_condition1,Label_condition2,Label_condition3 -u merged_assembly_cuffmerge.gtf  
\ Bam_condition1_rep1.bam,Bam_condition1_rep2.bam,Bam_condition1_rep3.bam  
Bam_condition2_rep1.bam,Bam_condition2_rep2.bam,Bam_condition2_rep3.bam  
Bam_condition3_rep1.bam,Bam_condition3_rep2.bam,Bam_condition3_rep3.bam
```

From the files retrieved from Cuffdiff the R Studio (1.2.5019) was used to plot a Venn diagram for differential expressed genes for the three conditions. Furthermore, a heatmap was created in R where the differentially expressed genes in the GO term for gluconeogenesis (GO:0006094). For the explicit code for the Venn diagram and heatmap, see Appendix.

### Transcription factor binding site analysis

The paper utilized the python package biopython to investigate TFBSS and CSREs for differentially expressed, gluconeogenesis associated, genes of interest. Since the procedure for this approach was not provided, it was not possible to recreate this analysis within the constraints of this reproductive effort. As an alternative,

## Appendix

This appendix gives the command log for the analysis made in this report. The first step was to download the fastq files and the reference genome.

```
# Downloading the fastq files  
wget https://www.ebi.ac.uk/arrayexpress/files/E-MTAB-7657/E-MTAB-7657.sdrf.txt  
# extracting the links of the fastq files  
cat E-MTAB-7657.sdrf.txt | cut -f29|tail -n+2 >links2download.txt  
# download the fastq files  
wget -N -i links2download.txt  
#expanding the fasta files  
gunzip *.gz
```

  

```
# Rename the fastq files  
#create a .tsv document with first column our names second column new names  
awk -F "\t" '{print $28".fastq\t"$1".fastq"}' E-MTAB-7657.sdrf.txt | tr '\t' '_' |  
tail +2 > num_to_fname.tsv
```

  

```
# rename using first column as source and second as new name  
while read line; do mv $line; done < num_to_fname.tsv
```

```
# Downloading reference genome  
#gtf file  
wget ftp://ftp.ensembl.org/pub/release-99/gtf/saccharomyces_cerevisiae  
/Saccharomyces_cerevisiae.R64-1-1.99.gtf.gz
```

  

```
#fasta file  
wget ftp://ftp.ensembl.org/pub/release-99/fasta/saccharomyces_cerevisiae/dna  
/Saccharomyces_cerevisiae.R64-1-1.dna.toplevel.fa.gz
```

  

```
gunzip *.gz
```

Thereafter conda environments were created to download the right versions of TopHat, Cufflinks and Biopython. This is to be able to try to reproduce the results from the NGS data analysis.

```
# Create an environment in conda  
conda create --name student4xxxx #create one for each software  
conda env list  
source activate student4xxxx
```

```
#Tophat environment conda, with name student4tophat  
conda install -c biobuilds tophat=2.0.14
```

  

```
#Cufflinks environment conda, with name student4cufflinks  
conda install -c bioconda cufflinks
```

  

```
#Biopython environment conda, with name student4biopython  
conda install -c montilib biopython
```

The first step in the NGS data analysis was to use TopHat to align the reads to the reference genome. To use TopHat the reference genome need to be indexed.

```
#installing a old version of readline (conda installed/updated the version)  
conda install -c conda-forge readline=6.2
```

