

# **BIOL 75302 (phytoinformatics)**

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<https://github.com/dpl10/phytoinformatics2023>

[Teams office hours by appointment]

Tuesdays & Wednesdays 2:00–5:00 PM

2023 January 25 through 2023 May 11

all course meetings via Teams

## **Objectives**

This course will provide students of plant organismal biology the computational tools needed to process and extract data from text files; basic POSIX command–line tools; introductory BASH and Python scripting; basic processing and interpretation of DNA/RNA/AA sequences; relational database structure; introductory Simple Query Language (SQL); and basic classification and regression machine learning tasks. By the end of the course you should be:

- (1) comfortable using the BASH command–line interface
- (2) able to extract and manipulate data in text files/streams at scale using text processing tools and pipes
- (3) able to run programs in batch mode in a single user environment
- (4) able write basic efficient BASH and Python scripts
- (5) able to query and retrieve sequences from GenBank using the API
- (6) able to assemble sequencing reads into useful contigs
- (7) able to extract useful data from assembled contigs
- (8) able to conduct sequence analyses including similarity and feature searches
- (9) able to write basic SQL queries for MariaDB
- (10) able to design a relational MariaDB database
- (11) able to train and use classification, regression, and segmentation machine learning models in TensorFlow

## Texts

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## Grading

weekly laboratory exercises (5% each, 60% total, the two lowest exercise scores will be dropped)

take-home final exam (40%)

Exam questions are mostly based on the laboratory exercises. Therefore it is very important that the laboratory exercises be completed.

Assignments are due at the beginning of class on the date specified. No late assignments will be accepted.

## Course schedule

**WEEK 1 (JANUARY 25).** Overview of grading, exams, and other logistics; phytoinformatics defined; overview of LINUX systems and distributions; the BASH shell. **Readings:** Arbutnott (1710); Eitner et al. (2010); Sobell & Helmke (2018: chapters 1 & 2). **Laboratory:** installing Ubuntu LINUX & BASH basics.

**WEEK 2 (JANUARY 31 & FEBRUARY 1).** Software installation; moving data: files, streams, and pipes. **Readings:** Sobell & Helmke (2018: chapters 3, 4, 5, & 8; appendix C). **Laboratory:** installing software.

**WEEK 3 (FEBRUARY 7 & 8).** BASH: scripts, parallelism, and job control; the power of command-line text tools. **Readings:** Sobell & Helmke (2018: chapters 10 & 14); What is code? (<https://www.bloomberg.com/graphics/2015-paul-ford-what-is-code/>). **Laboratory:** BASH scripts, parallelism, and job control.

**WEEK 4 (FEBRUARY 14 & 15).** Basic scripting in AWK, Perl, and Python3. **Readings:** Sobell & Helmke (2018: chapters 11 & 12; appendix A). **Laboratory:** LINUX command-line text processing tools.

**WEEK 5 (FEBRUARY 21 & 22).** Basic Python3, data structures, operators, and conditionals; DNA-DNA binding. **Readings:** Khandelwal & Bhyravabhotla (2010); Matthes (2019: chapters 1, 2, 3, 4, 5, & 6); Rychlik et al. (1990). **Laboratory:** beginning Python3 (PCR primer annealing temperature calculations).

**WEEK 6 (FEBRUARY 28 & MARCH 1).** Python3 loops and functions; DNA/RNA/AA sequence search. **Laboratory:** more beginning Python3 (BLAST & FASTA processing). Matthes (2019: chapters 7, 8, & 10)

**WEEK 7 (MARCH 7 & 8).** DNA/RNA/AA sequence search and alignment. **Readings:** Altschul et al. (1990, 1997); Buchfink et al. (2021); Eddy (2004, 2011); Metropolis et al. (1953); Needleman & Wunsch (1970); Pertsemlidis & Fondon (2001); Schuler (1997); Smith & Waterman (1981). **Laboratory:** BLAST and e-PCR.

**WEEK 8 (MARCH 14 & 15).** More DNA/RNA/AA sequence alignment. **Readings:** Abascal et al. (2010); Edgar (2004a,b); Katoh et al. (2002); Katoh & Toh (2008); Lassmann & Sonnhammer (2005); Phillips et al. (2000). **Laboratory:** multiple sequence alignment.

**WEEK 9 (MARCH 21 & 22).** Raw DNA sequence quality, processing, assembly, and mapping. **Readings:** Allam et al. (2015); Dobin et al. (2013); Jackman et al. (2017); Lin et al. (2011); Simpson et al. (2009); Warren et al. (2007). **Laboratory:** sequence assembly and remapping.

**WEEK 10 (MARCH 28 & 29).** Open reading frame identification, GO, and InterPro. **Readings:** Ashburner et al. (2000); Jones et al. (2014); Kulmanov & Hoehndorf (2020); Ter-Hovhannisyan et al. (2008). **Laboratory:** getting GO.

**WEEK 11 (APRIL 4).** An overview of database types, the structure of relational databases, and introduction to SQL. **Readings:** Codd (1970); Sobell & Helmke (2018: chapter 13). **Laboratory:** basic MariaDB.

**WEEK 12 (APRIL 18 & 19).** SQL queries of relational databases. **Readings:** the MariaDB manual (<https://mariadb.com/kb/en/documentation/>). **Laboratory:** intermediate MariaDB.

**WEEK 13 (APRIL 25 & 26).** Machine learning input, output, layers, and basic training. **Readings:** the TensorFlow manual (<https://www.tensorflow.org/guide>); LeCun et al. (2015); Min et al. (2016); Li et al. (2019). **Laboratory:** TensorFlow image classification.

**WEEK 14 (MAY 2 & 3).** Intermediate training, basic model structures, and TensorFlow. **Readings:** Beyer et al. (2021); Chen et al. (2020); Dwibedi et al. (2021); Hassani et al. (2021); Hinton et al. (2015); Zhang et al. (2018). **Laboratory:** TensorFlow sequence regression.

**WEEK 15 (MAY 9 & 10).** Intermediate model structures; Semester review. **Readings:** Iandola et al. (2016); Qiu et al. (2021); Szegedy et al. (2016); Vaswani et al. (2017); Yu et al. (2021). **Laboratory:** TensorFlow image segmentation.

*Take home final exam distributed May 10, due May 23.*