

BioE241 labs

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*Of all natural systems, living matter preserves inscribed in its organization the largest amount of its own past history .... no other system is better aufgehoben: constantly abolished and simultaneously preserved.* [Pauling and Zuckerkandl, 1963]

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# Chapter 1

## Introduction

This handout describes a series of labs for BioE241, accompanying the theoretical lectures in that class, which describe various statistical models for biological data.

The class has a (non-exclusive) emphasis on models that describe the evolution of DNA, RNA and amino acid sequences on phylogenetic trees.

Other software tools are also used. The labs also ask you to develop some pseudocode and actual implementations (generally in a programming language of your choice) and to do a small amount of elementary math.

### 1.1 Useful URLs

BioE241 class homepage	<a href="http://biowiki.org/BioE241">http://biowiki.org/BioE241</a>
DART software homepage (used by most of the labs)	<a href="http://biowiki.org/DART">http://biowiki.org/DART</a>
Class materials repository (lecture notes, these lab handouts, data files)	<a href="https://github.com/ihh/bioe241">https://github.com/ihh/bioe241</a>
DART source code repository	<a href="https://github.com/ihh/dart">https://github.com/ihh/dart</a>



## Chapter 2

# Simulation

Goal of this lab: Simulate a discrete-state continuous-time Markov chain.

Provide pseudocode for more than one of these.

Implement at least one.

### **PRESENTATION: Video of simulation**

Several options available. Generate series of images using e.g. scripting language + library. Use Berkeley MPEG encoder to stitch together into a movie, or use one of various applications on desktop OS's that will do this.

#### **2.1 Simulate from an exponential distribution by inverting the cumulative distribution**

Pseudocode to be provided.

#### **2.2 Simulate the general reversible-time nucleotide model over a finite time interval**

#### **2.3 Simulate the general reversible-time nucleotide model over a phylogenetic tree**

#### **2.4 Simulate Gillespie's algorithm**

[Gillespie, 1977]

## **2.5 Simulate the spatial Lotka-Volterra model on a 2D lattice**

Easy: discrete-time version. Hard: continuous-time version.

Collect summary statistics.

## **2.6 Simulate the 1D Ising model and the methylation-induced-CpG-deamination model**

It may be easiest to implement the general nearest-neighbor irreversible-time nucleotide model, as both the Ising and CpG models are a subset of this.



## Chapter 3

# Homology search

Goal of this lab: Use profile HMM training and search tools to build a family of homologous protein domain sequences.



## Chapter 4

# Phylogeny

Goal of this lab: Reconstruct the phylogenetic history of sequences.



## Chapter 5

# Alignment

Goal of this lab: Use probabilistic models to align protein sequences and reconstruct ancestors, on a given phylogeny.



## Chapter 6

# Statistical alignment

Goal of this lab: Simultaneously reconstruct the phylogeny and the alignment.





## Chapter 7

# Mutation rate estimation

Goal of this lab: Estimate the indel and substitution rates.



## Chapter 8

# RNA folding

Goal of this lab: Use probabilistic models to predict the structure of a single RNA sequence.



## Chapter 9

# Comparative RNA folding

Goal of this lab: Given two related RNA sequences, simultaneously align them and predict their common secondary structure.



## Chapter 10

# RNA structure phylogenetics

Goal of this lab: Annotate conserved secondary structure in an RNA multiple alignment and reconstruct ancient RNA sequences.





## Chapter 11

# Lineage-specific evolution

Goal of this lab: Develop and fit models that allow for lineage-specific evolutionary effects.



## Chapter 12

# Recombination

Goal of this lab: Detect recombination breakpoints in multiple sequence alignments.



## Chapter 13

# Probabilistic logic programming

Goal of this lab: Use PRISM to prototype probabilistic models using statistical logic programming.



## Chapter 14

# Space

Goal of this lab: Simulate and analyze spatiotemporal models of evolution, epidemiology, ecology, and population dynamics.





## Chapter 15

# Diffusion

Goal of this lab: Analyze and fit data to continuous-valued diffusion processes.



# Bibliography

- [Gillespie, 1977] Gillespie, D. T. (1977). Exact stochastic simulation of coupled chemical reactions. *Journal of Physical Chemistry*, 81:2340–2361.
- [Pauling and Zuckerkandl, 1963] Pauling, L. and Zuckerkandl, E. (1963). Chemical paleogenetics, molecular “restoration studies” of extinct forms of life. *Acta Chemica Scandinavica*, 17:S9–S16.