#### Genome 540

Introduction to Computational Molecular Biology:

Genome and protein sequence analysis

## Today's Lecture

• Course overview

• Administrative details

• Finding exact matches in sequences using suffix arrays

# **Computational Molecular Biology**



#### Course Lecture Content

- DNA and protein sequences
  - Algorithms
    - Dynamic programming
  - Probability models
    - HMMs
    - Information theory

#### We do *not* cover:

- 'Non-linear' (non-sequence based) computational biology
  - protein structure, expression arrays, metabolic pathways, models for interacting molecules ...
- 'Machine learning' applications
- Existing software tools

# **Course Prerequisites**

- You *must* 
  - be able to write programs for data analysis
  - have access to a computer where you can write & run your programs
  - HW assignment # 1 will be a good test!
- Some previous familiarity with
  - probability and statistics
  - molecular biology
  - is highly desirable
    - (if you lack it, you will have to work harder!)

# **Course Requirements**

- Homework
- No tests or exams
- Attendance at discussion section strongly encouraged but not required
- Ask questions!
  - in lecture
  - at discussion section
  - by email
  - (via message board)

## Homework

- Due weekly, Sunday at midnight
  - Posted on web site approx 1.5 weeks in advance
  - Each is 10 pts, late penalty of 1 pt/day (max penalty 3 pts)
  - Can redo
- write computer program to analyze genomic data set
  - "From scratch", i.e. not using prewritten routines from elsewhere
  - Run on your own computer
  - Programming language is up to you but a compiled language (e.g. C, C++) is recommended for efficiency reasons
    - Python + Cython also works
    - Interpreted language may work, but risky!

- Also: readings (in textbooks, or journal articles)
- turn in results of analysis, and your program, with (in some cases) a written interpretation of the results;
  - all to be submitted by email in computerreadable format

## Course Info

- Instructors (contact info is on web page):
  - Phil Green
  - TA: Eliah Overbey
- Office hours by appointment (send Eliah or me an email)
- *if you did not receive the email I sent yesterday,* send me (<u>phg@uw.edu</u>) your email address *today* (whether or not you are registered!)

- Lectures: TuTh 10:30-11:50, Foege S-110
- Weekly discussion section:
  - discuss homework, answer questions
  - review background material
  - related topics (next-gen sequencing?)
  - *Tentative* time/place: Th 12-1, Foege S-040
    - If you have a conflict, *email me* your schedule of unavailable times & we will try to find another
- Web site: <u>http://www.phrap.org/compbio/mbt599</u>
  - will post HW assignments, copies of slides here
  - has link to last year's site for approx syllabus & slides

# Texts (will follow only loosely):

- Biological Sequence Analysis: Probabilistic Models of Proteins and Nucleic Acids by Durbin, Eddy, Krogh & Mitchison. Paperback, ~\$60.
- Statistical Methods in Bioinformatics : An Introduction (Statistics for Biology and Health) by Ewens & Grant. Hardbound, ~\$105. N.B. This is the 2D edition!
- available from UW Bookstore (South Campus Center branch) or from Amazon or Barnes & Noble

Finding perfectly matching subsequences of a sequence

- Idea (*much* more efficient than 'brute force' approach):
  - *suffix array* (Manber & Myers, 1990)
  - make list of pointers to all positions in sequence
  - lexicographically sort list of strings that are pointed to
  - process the list: adjacent entries are "maximally agreeing"

#### Suffix array step 1: List of Pointers to Suffixes ACCTGCACTAAACCGTACACTGGGTTCAAGAGATTTCCC

ACCTGCACTAAACCGTACACTGGGTTCAAGAGATTTCCC  $p_1$ CCTGCACTAAACCGTACACTGGGTTCAAGAGATTTCCC CTGCACTAAACCGTACACTGGGTTCAAGAGATTTCCC TGCACTAAACCGTACACTGGGTTCAAGAGATTTCCC GCACTAAACCGTACACTGGGTTCAAGAGATTTCCC CACTAAACCGTACACTGGGTTCAAGAGATTTCCC ACTAAACCGTACACTGGGTTCAAGAGATTTCCC CTAAACCGTACACTGGGTTCAAGAGATTTCCC TAAACCGTACACTGGGTTCAAGAGATTTCCC AAACCGTACACTGGGTTCAAGAGATTTCCC **p**<sub>10</sub> AACCGTACACTGGGTTCAAGAGATTTCCC  $p_{11}$ ACCGTACACTGGGTTCAAGAGATTTCCC **p**<sub>12</sub>

 $\mathbf{p}_2$ 

**p**<sub>3</sub>

 $p_4$ 

 $p_5$ 

 $p_6$ 

**p**<sub>7</sub>

 $p_8$ 

**p**<sub>9</sub>

### Suffix array step 2: View as Strings to be Compared ACCTGCACTAAACCGTACACTGGGTTCAAGAGATTTCCC

ACCTGCACTAAACCGTACACTGGGTTCAAGAGATTTCCC  $p_1$ CCTGCACTAAACCGTACACTGGGTTCAAGAGATTTCCC  $\mathbf{p}_2$ CTGCACTAAACCGTACACTGGGTTCAAGAGATTTCCC  $p_3$ TGCACTAAACCGTACACTGGGTTCAAGAGATTTCCC  $p_4$ GCACTAAACCGTACACTGGGTTCAAGAGATTTCCC  $p_5$ CACTAAACCGTACACTGGGTTCAAGAGATTTCCC  $p_6$ ACTAAACCGTACACTGGGTTCAAGAGATTTCCC  $p_7$ CTAAACCGTACACTGGGTTCAAGAGATTTCCC  $p_8$ TAAACCGTACACTGGGTTCAAGAGATTTCCC **p**<sub>9</sub> AAACCGTACACTGGGTTCAAGAGATTTCCC **p**<sub>10</sub> AACCGTACACTGGGTTCAAGAGATTTCCC  $p_{11}$ ACCGTACACTGGGTTCAAGAGATTTCCC **p**<sub>12</sub>

# Suffix array step 3: Sort the Pointers Lexicographically

 $p_{10}$  $p_{11}$  $p_{28}$ **p**<sub>17</sub> **p**<sub>12</sub>  $\mathbf{p}_1$  $\mathbf{p}_7$ **p**<sub>19</sub>  $\mathbf{p}_{29}$ **p**<sub>31</sub> **p**<sub>33</sub> **p**<sub>27</sub> AAACCGTACACTGGGTTCAAGAGATTTCCC AACCGTACACTGGGTTCAAGAGATTTCCC AAGAGATTTCCC ACACTGGGTTCAAGAGATTTCCC ACCGTACACTGGGTTCAAGAGATTTCCC ACCTGCACTAAACCGTACACTGGGTTCAAGAGATTTCCC ACTAAACCGTACACTGGGTTCAAGAGATTTCCC ACTGGGTTCAAGAGATTTCCC AGAGATTTCCC AGATTTCCC ATTTCCC CAAGAGATTTCCC

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Finding Matching Subsequences Using the Sorted List of Pointers

- Perfectly matching subsequences
  - (more precisely the pointers to the starts of those subsequences)

are "near" each other in the sorted list

- For a given subsequence, a *longest* perfect match to it is *adjacent* to it in the sorted list
  - (there may be other, equally long matches which are not adjacent, but they are nearby).

# (Average Case) Complexity Analysis

- If N = sequence length, sorting can be done with
  - O(Nlog(N)) comparisons,
  - each requiring  $O(\log(N))$  steps on average,
  - for an overall complexity of  $O(N(\log(N))^2)$ .
    - (Processing the sorted list requires an additional O(N) steps which does not affect the overall complexity).
- Manber & Myers (1990) have more efficient algorithm (*O*(*N*log(*N*)))
- several O(N) algorithms are now known but the best implementations are not as fast as O(Nlog(N)) algorithms, even for very large genomes!!
- $\exists$  other, older O(N) methods ('suffix trees'), but these are
  - much less space efficient,
  - harder to program, and
  - (probably) slower in practice

- HW #1 (to be posted soon) asks you to apply this algorithm to find
  - longest perfectly matching subsequences in 2 genomic sequences & their reverse complements.
- much faster than an  $O(N^2)$  algorithm (e.g. Smith-Waterman, or even BLAST), *but*
- limited to finding *exact* matches