

CS 260-1: “Pattern Discovery in Biosequences”

Reading list

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General References

Books

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- Pierre Baldi and Soren Brunak, *Bioinformatics: the Machine Learning Approach*, MIT Press, 2nd edition, 2001.

Papers

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1 Motifs discovery

- Emotif <http://motif.stanford.edu/emotif/>
- Verbumculus <http://www.cs.ucr.edu/~stelo/Verbumculus/>
- Pratt <http://www.ii.uib.no/~inge/Pratt.html>
- Chapter 4 of Jason Wang, Bruce A. Shapiro, and Dennis Shasha, *Pattern Discovery in Biomolecular Data Tools, Techniques, and Applications*, Oxford University Press, 1999.
- Giulio Pavesi, Giancarlo Mauri, and Graziano Pesole, “An algorithm for finding signals of unknown length in DNA sequences”, *Bioinformatics* 17: 207-214, 2001.
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- Andrea Califano, “SPLASH: Structural Pattern Localization Analysis by Sequential Histogramming”, *Bioinformatics* 15, 341–357, 2000.
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1.1 Motif discovery by Gibbs sampling

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1.2 Motif discovery by expectation maximization

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- Meta MEME <http://metameme.sdsc.edu/>
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- Timothy L. Bailey and Michael Gribskov, ”The Megaprior Heuristic for Discovering Protein Sequence Patterns”, *Proc. of the Fourth International Conference on Intelligent Systems for Molecular Biology*, 15–24, 1996.
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2 DNA segmentation

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3 Finding genes

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- GenScan <http://genes.mit.edu/GENSCAN.html>
- HMMGene <http://www.cbs.dtu.dk/services/HMMgene/>
- Grail <http://compbio.ornl.gov/Grail-1.3/>
- GenMark.hmm http://dixie.biology.gatech.edu/GeneMark/gmhmm2_prok.cgi
- VEIL <http://www.tigr.org/~salzberg/veil.html>
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4 Finding regulatory elements

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5 Finding splicing sites

- Splice Prediction using ANN http://www.fruitfly.org/seq_tools/splice.html
- ISIS: http://isis.bit.uq.edu.au/a_splicers.html

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6 Statistical analysis of gene expression data

- <http://linkage.rockefeller.edu/wli/microarray/> is an excellent starting point for resources on micro array literature, groups, companies, etc.
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6.1 Clustering

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7 Protein classification

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8 Finding MARs

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9 Compression & sequence analysis

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10 Mining PubMed

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