

Bioinformatics Compendium

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A rough guideline of topic refreshers and tools to help with the breadth of bioinformatics. This compendium was originally made after a few self directed courses in 2017-2018 and further updated as my personal knowledge grew. Much of the later half is a more superficial overview of concepts with brief notes.

Overview:

1. Sequence Assembly
 - 1.1. DNA genomic
 - 1.2. RNA transcriptome specific
2. Alignment
 - 2.1. NGS Alignment
 - 2.1.1. Short Sequence – illumine, ion
 - 2.1.2. Splice capable – illumine, ion
 - 2.1.3. Long Sequence – pacbio, nanopore
 - 2.2. Single Alignment
 - 2.3. Multiple Sequence Alignment
 - 2.4. Long Sequence Alignment
3. Artificial Read Generators
4. Phylogenetic Analysis
 - 4.1. Methods
 - 4.2. Programs
5. Biological Networks
6. Probability of sequence observations
7. Clustering
8. Motif Analysis
9. Epigenomic Analysis
10. RNA structure analysis
11. Mass Spectrometry Analysis
12. Protein Structure prediction

Sequence Assembly

- De Novo – without reference to a database, produces sometimes novel sequences.
 - Greedy algorithm assemblers
 - De Bruijn graph assembler- most popular with next gene sequencing
 - a short list of *some* De Novo assemblers
 - https://en.wikipedia.org/wiki/De_novo_sequence_assemblers
 - **Spades**
 - **Ray**
 - **AbySS**
 - **ALLPATHS-LG**
 - **Trinity**

- There are some De Novo transcriptome assembly programs that are separate, for RNA-Seq. **This is the wiki list as of 2020**
 - Annotaters
 - **Blast2GO**
 - **Goanna**
 - **KEGG** – for metabolic pathways following annotation
 - **SeqMan Ngen**
 - **SOAPdenovo-Trans**
 - **Velvet/Oases**
 - **Trans-AbySS**
 - **Trinity**

Alignment

- **NGS Alignment**
 - *Short sequence alignment – illumine, ion*
 - **BWA** – various different versions to this aligner, benchmarks strongly
 - **Bowtie2** – Fairly fast and memory safe, Burrows Wheeler
 - *Splice-capable*
 - **STAR** – Alternate splice site, different versions can handle short and long NGS reads
 - **Hisat2** – Can handle alternate splice sites
 - **Tophat2** – Can handle alternate splice sites... deprecated in favor of Hisat2
 - **BMap**
 - **GMap**
 - *Long read alignment – pacbio, nanopore*
 - **Minimap2**
 - **NGMLR**
 - **GraphMap**
 - **LAST**
 - **deSALT**
- **Single alignment(576)**
 - Matrix Types
 - Substitution matrix, chance of alignment
 - **BLOSUM45**
 - **BLOSUM50**
 - **BLOSUM62**empirically works the best**
 - **PAM** - position weighted c/sum(c)
 - **BLOck sUbstitution Matrix (BLOSUM) 62**
 - Needleman-Wunsch Global alignment
 - Smith-waterman local alignment
 - derived from set of aligned ungapped regions from protein families called **BLOCKS**
 - calculate substitution frequencies
 - positive for chemically similar substitution
 - common amino acids have low weights
 - rare amino acids have high weights
 - Assigning significance to alignment score
 - Bayesian framework
 - Classical approach

- Extreme Value distribution
 - look at the probability of a random score, if it is less likely than our alignment score then the score is considered significant. Plot all your scores vs randoms and get a distribution of these comparative scores.
 - Bayes theorem
 - Heuristic Algorithms
 - **BLAST**
 - basic local alignment search tool
 - compile a list of high scoring words of score at least T, index database then **extend hits**.
 - A tradeoff between running time and sensitivity
 - don't extend a hit when the score falls below a specified threshold
 - **FASTA**
 - starts with exact seed matches instead of inexact matches that satisfy a threshold
 - extends like blast
 - join high scoring seeds allowing for gaps
 - re-align high scoring matches using dynamic programming
 - Different kinds of BLAST programs(program – Query from Database)
 - **BLASTP** – protein from protein
 - **BLASTN** – DNA from DNA
 - **BLASTX** – translated DNA from protein
 - **TBLASTN** – protein from translated DNA
 - **TBLASTX** – translated DNA from translated DNA
 - Sequence databases
 - Web portals, knowledge bases
 - **NCBI**
 - **EBI**
 - **Sanger**
 - Nucleotide sequences
 - **Genbank**
 - **EMBL-EBI** nucleotide sequence database
 - Comprise ~ 8% of the total database
 - Protein sequences
 - **UniProtKB**
- **Multiple sequence alignment(576)**
 - Methods
 - Build phylogenetic trees
 - Algorithms
 - Progressive alignment algorithms
 - Star alignment
 - Guide tree approach- similar to phylo
 - Iterative alignment algorithms
 - Such as those employed in CLUSTAL omega can account for early bias in leaf nodes during tree construction
 - Dynamic programming is not feasible for larger and more reads $O(n^2k)$

- Scoring
 - Entropy based scores- best when we are most uncertain
 - sum of pairs – for a deterministic even, more certain(BLOSUM and PAM do this)
- Programs *incomplete list*
 - <https://www.ebi.ac.uk/Tools/msa/>
 - **Clustal omega**- guide tree based alignment
 - **Kalign**-large alignments
 - **MAFFT**
 - **MUSCLE**-fast and has good quality alignment
 - **Mauve** - fast and lightweight
 - **PSAlign**
- **Long Sequence Alignment(776)**
 - **MUMmer System**
 - Indexing maximal unique matches to a myriad of large matches using preprocessed strings. Then extend these strings. Do normal substitution matrix scoring afterward to fill in some of the gaps
 - Suffix tree
 - Comparative models and operating time(fastest to slowest)
 - *LIS*- Longest increasing subsequence
 - Suffix tree
 - **Smith-Waterman**
 - FASTA -dead last by a couple orders of magnitude
 - **LAGAN**(slightly better at covering alignment compared to MUMmer)
 - Three step method using 10-mer alignment allowing one mismatch
 - utilizes a trie to represent all the 3-mers of the sequence
- **Multiple Whole Genome Alignment(776)**
 - **MLAGAN**
 - requires phylogenetic tree
 - Greedy solution with local refinement
 - **Mercator**
 - Define probabilistic model to solve globally
 - Inference is intractable, resort to approximations

Artificial Reads Generator

- DWGSIM (<http://sourceforge.net/projects/dnaa/>)
- ART
- Wgsim (<https://github.com/lh3/wgsim>)

Phylogenetic Trees

- Methods
 - Distance-based
 - UPGMA – often incorrect because ultrametric notion of distance overfits
 - Neighbor joining/nearest neighbor – unrooted trees
 - Assume additivity and sometimes a “molecular clock”
 - Alignment-based methods
 - Parsimony – weighted
 - many more methods than graph search but

- hill-climbing
 - Branch and bound
- Probabilistic
 - so this seems to be what all the programs actually utilize, Bayes and maximum likelihood
 - felsensteins algorithm
- Rooting a tree(afterward)
- use a species that is distantly related enough to show the fork
- Programs
 - **PAML** – maximum likelihood
 - **BEAST2** – Bayesian
 - **phytools** – maximum likelihood
 - **COUNT** – maximum Parsimony, maximum likelihood
 - **ANGES** – Local Parsimony
 - https://en.wikipedia.org/wiki/List_of_phylogenetics_software
 - https://en.wikipedia.org/wiki/List_of_phylogenetic_tree_visualization_software

Biological Networks

- Molecular networks (Omic networks)
 - Physical Networks
 - Transcriptional regulatory networks(overlap between metabolic network modeling tools)
 - Nodes – regulatory protein like a TF or target gene
 - Edges -TF A regulates C
 - Directed, signed, weighted graph
 - **BioCyc**
 - Protein - protein
 - Vertices – proteins
 - Edges – Protein U physically interacts with protein X
 - Undirected graph
 - Signaling networks
 - Vertices – enzymes and other proteins
 - Edges – Enzyme P modifies protein Q
 - Directed graph
 - **PathLinker- prediction algorithms**
 - **Literome**
 - **Chilibot**
 - **iHOP**
 - **eQTL electrical diagrams**
 - **HotNet – random walks/ network diffusion/ circuits**
 - Alternative pathway identification papers
 - Physical Network
<http://online.liebertpub.com/doi/abs/10.1089/1066527041410382>
 - Maximum Edge Orientation <http://nar.oxfordjournals.org/content/39/4/e22.full>
 - Signaling and Dynamic Regulatory Events Miner
<http://www.genome.org/cgi/doi/10.1101/gr.138628.112>
 - Steiner forest -
<http://journals.plos.org/ploscompbiol/article?id=10.1371/journal.pcbi.1002887>
 - Omics Integrator - <http://dx.doi.org/10.1371/journal.pcbi.1004879>
 - shortest paths+ steiner tree ANAT <http://msb.embopress.org/content/5/1/248>

- Functional Networks
- Metabolic network modeling
 - Vertices – enzymes
 - Enzyme M and N share a metabolite
 - Undirected and weighted graph
 - **PathoLogic**
 - **ERGO** in combination with libraries like **MetaCyc**
 - **PathwayTools**
 - **databases**
 - Kyoto encyclopedia of genes and genomes
 - Biocyc, EcoCyc, and MetaCyc
 - BRENDA
 - BiGG
 - metaTIGER
- Genetic interaction networks (https://en.wikipedia.org/wiki/Gene_regulatory_network)
 - **SGNSim, stochastic gene networks simulator**
 - **Gillespie algorithm**
- Bayesian Networks
 - A graph which is directed and acyclic
 - hill climbing search algorithm not as good
 - ***Sparse candidate***- for larger data sets like bioinformatics
 - A set of conditional distributions
- Module Networks
 - Type of bayesian networks but Conditional probability distribution represents a cluster of genes instead of individual nodes
 - sequential update, best to cluster by 10 modules for best results
 - Outperform many basic Bayesian networks
 - **LeMoNe – Learning Module Networks**
 - **LIRNET – Learning a Prior on Regulatory Potentia from eQTL data**
 - how to find dense subgraphs with large numbers of connection
 - **HOTNET – A set cover approach**
 - **NETBAG – Network based analysis of genetic associations**
- Dependency networks Regression
 - GENIE3 algorithm for learning a dependency network from expression data'
 - TIGRESS
- Mutual Information
 - **ARACNE**
- General applications of Networks
 - Differential subgraph identification
 - given gene expression from disease and normal studies
 - identify pathways that are most differentially altered between conditions
 - Module detection
 - Dense subgraph identification
 - Interpretation of gene sets
 - Identification of novel pathways
 - Set cover based methods
 - Network information flow
 - Sparse subgraph identification

- Interpretation of gene sets
- Prioritization of genes

Probability of sequence observations/ Gene Finding

- HMM
 - How likely is an HMM to have generated a given sequence
 - forward algorithm
 - what is the most likely “path” for generating a sequence of observations
 - Viterbi algorithm
 - Parameter estimation: How can we learn an HMM from a set of sequences?
 - Forward backward or Baum-Welch (an EM algorithm)
- Phylo-HMM multiple sequence conserved elements in the genome
 - emmisoin is a column of a multiple sequence alignment
 - Probability of an alignment and path
 - Phastcons: a phylo-hmm for finding conserved sequence elements
 - **MutationTaster-free**
 - **PhastCons/PHAST compgen.cshl.edu/phast/**
- ChromHMM/ Histone code HMM epigenetic markers
 - used with **ChIP-seq – FASTQC**
 - file type called FASTQ which is the standard as of 2016
 - then genomic Co-ordinates uses “bam”
 - segmentation (transformation) uses “wig”
 - last is actual analysis, statistic, visualization.
- Interpolated MM
 - **GLIMMER**
 - 8th order, inhomogenous, interpolated markov chain models
 - essentially ORF classification
- Eukaryotic gene finding
 - GENSCAN HMM
 - Pair HMMs

Clustering

- Motivation
 - Exploratory data analysis
 - visualization
 - understanding general characteristics of data
 - Generalization
 - infer something about a omic set based on how it relates to other objects
 - sense of k then use
 - Gaussian or k-means
 - control for the extent of dissimilarity
 - hierarchial
 - deterministic
 - Hierarchical
- Flat
 - K-means- hard clustering algorithm
 - **sklearn import Kmeans**
 - Model-based clustering
 - Gaussian mixture models -soft clustering algorithm
 - utilizes EM algorithm to learn GMM parameters

- **Python module sklearn import GMM**
- Hierarchical
 - Top-down (divisive)
 - Bottom up (agglomerative)
 - **python module scikit**
 - **python module SciPy**
- how to measure transcriptomes
 - microarrays- *older tech that's still used in diagnostics*
 - **cDNA/Spotted arrays**
 - This is hybridized usually between a control and normal on plate
 - Oligonucleotide arrays
 - uses ssDNA spanning the entire genome
 - **Affymetrix – Most common microarray**
 - **Nimblegen**
 - Sequencing
 - **RNA-seq**
 - few drawbacks

Motif Analysis

- Learning Sequence Motif Model Using Expectation (EM) (MEME)
 - **MEME Suite*****
- Mutual Information motif FIRE (Promoters and terminators)
 - Tons of tools at: <https://molbiol-tools.ca/Promoters.htm>
- Quantitative trait loci (continuous phenotypes) Gene exp and metabolite abundance *incomplete list*
 - <https://omictools.com/qtl-mapping-category>
 - **RASQUAL**
 - **WEBQT**
 - **R/qtl**
 - **Qgene**
- GWAS studies(discrete phenotypes) IE disease status is binary

Epigenomic Analysis

- Algorithms
 - ChromHMM
 - Segway: Dynamic Bayesian network
- Database
 - RegulomeDB
- Programs
 - **CLCbio – Qiagen *** Helpful for a variety of things in gene mapping**
- Protein Interaction Quantification(PIQ)
 - **PIQ - <http://piq.csail.mit.edu/download.html>**
 - Eukaryotic
 - bacterial
 - Prokaryotic
 - **ROC curve – confusion matrix statistic**
 - **HINT-performs best**
 - **Dnase2TF**
 - **Neph**
 - **Wellington**

- **CENTPEDE**
- Gaussian bivariate
 - <https://github.com/SheffieldML/GPy>
- Combined Annotation Dependent Depletion (CADD)
 - Example of an algorithm that integrates multiple types of evidence into a single score
 - Conservation
 - Epigenetic information
 - Protein Function scores for coding variants
 - Algorithms/programs
 - **DeepSEA**
 - **DeepLIFT**

RNA-Seq

- RNA-Seq- Reverse-transcriptase-PCR
- multireads can be recovered
- RSEM
 - RNA-Seq by Expectation-Maximization- a generative probabilistic model
- Public sources of RNA-Seq data
 - Gene Expression Omnibus (GEO): <http://www.ncbi.nlm.nih.gov/geo/>
 - Sequence Read Archive (SRA): <http://www.ncbi.nlm.nih.gov/sra>
 - ArrayExpress: <https://www.ebi.ac.uk/arrayexpress/>

Mass spectrometry Analysis

- applications
 - Targeted proteomics
 - Metabolomics
 - Lipidomics
 - Quantify abundance or state of all(many) proteins
- SEQUEST/PSM(peptides spectrum match)
 - peptide matching

RNA structure Analysis

- General Algorithms
 - Nussinov
 - Energy Minimization
 - **Mfold**
 - **RNAfold**
- Grammer
 - CFG – context free grammer
 - SCFG - stochastic
 - Algorithms- all have parallels with vitebi/forward-backward HMM algorithms
 - how likely – The Inside algorithm
 - most proxaxle parse – Cocke- Younger-Kasami (CYK) algorithm
 - what are SCFG parameters given a grammar and a set of sequences – Inside-Outside algorithm
 - **CONTRAFold**
- Software
 - Vienna
 - Nupack

- https://en.wikipedia.org/wiki/List_of_RNA_structure_prediction_software
 - MASSIVE list with a myriad of programs
- **CenterFOLD**
- **CentroidHomfold**
- **CyloFold**

Protein Structure Prediction

- Experimentally determined by expensive methods
 - x-ray crystallography
 - nuclear magnetic resonance (NMR)
 - cryo-electron microscopy
- Prediction in 3D (https://en.wikipedia.org/wiki/List_of_protein_structure_prediction_software)
 - Homology modeling
 - *Protein threading*
 - modified branch and bound
 - **IntFOLD**
 - **RaptorX**
 - Denovo Structure prediction
 - **AlphaFold**
 - **RoseTTAFold**
 - Fold recognition
 - **alphafold**
 - **Foldit.it**
 - **IntFOLD**
 - **RaptorX**
 - Fragment assembly
 - **Rosetta**
 - <http://boinc.bakerlab.org>
 - **Efold**
 - **QUARK**
 - **FALCON**
 - Molecular dynamics
 - **Folding@home**
 - <http://folding.stanford.edu>
 - **Abalone**
- Secondary structure prediction
 - https://en.wikipedia.org/wiki/List_of_protein_secondary_structure_prediction_programs
 - **SPIDER2**
 - **RaptorX-SS8**
 - **s2D**