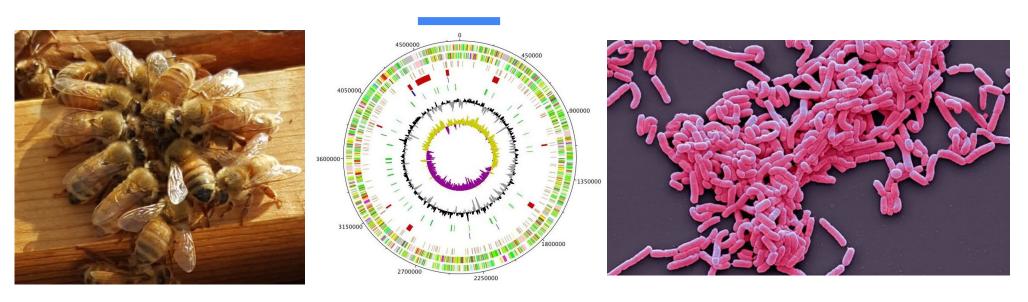
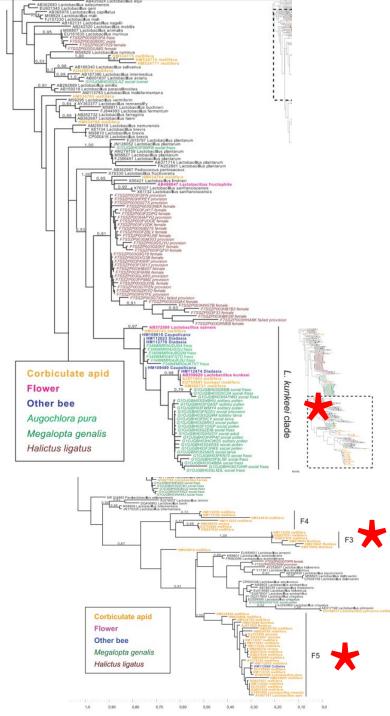
# Phylogeny and genomic characterization of bee-associated *Lactobacillus* species and their closest relatives



Eric Gordon, Kaleigh Russell, Hoang Vuong, and David Haisten

### Lactobacillus and bees

- Many Lactobacillus spp. are associated with bees and their environment (3 main clades \* based on 16S data) but most in the genus are not associated with bees (Mcfrederick et al 2012).
- "Core gut microbiome": Firm4, Firm5, and *L. kunkeei* clade-important for nutrition.
- Lactobacillus kunkeei is a major symbiont of honey bees AND wild bees worldwide.
- It can be found in the honey bee gut, bee bread, honey, and honey bee larvae.



## Problems / Questions

- Looking at 16s data alone, may leave out relevant information on species relatedness and evolutionary history.
- Horizontal gene transfer?
- Are there particular genes important for living in bees?
- Do different species of bee associates have different niches within bees?
- Goals:

Create pipeline for analysis of bacterial genomes:

- 1. Assemble and annotate raw data
- 2. Identify orthologs
- 3. Construct alignments
- 4. Produce gene and species trees

### Methods Overview:

- Initially started with 36 annotated *Lactobacillus* spp. genomes from NCBI database -- including 12 strains of *Lactobacillus kunkeei* & 9 other species of bee associates along with 15 non-bee associated close relatives.
- Lactobacillus brevis as outgroup.
- Assembly and Annotation using Velvet and Prokka
- OrthoMCL assess orthologs of protein sequences
- Phylogenetic analysis using RaxML

## Hypothetical Workflow

Assemble raw reads (Velvet)

Annotate for protein sequences (GeneMarkHMM)

Concatenate (x)

Reconstruct individual gene trees and species trees

Assess incongruence in gene trees

Back-translate to nucleotide based on amino acid alignments (script and Biopython tool)

Align (MAFFT)

Single copy orthologs (in all genomes)

Filter for genes which could be assessed for selection (present in all or most of a clade)

Assess selection pressure or dN/dS by comparing genes in bee associates with genes in their sister groups (PAML)

Ortholog assessment (OrthoMCL) Genbank proteomes

Other orthologs (either missing or with paralogs in some taxa)

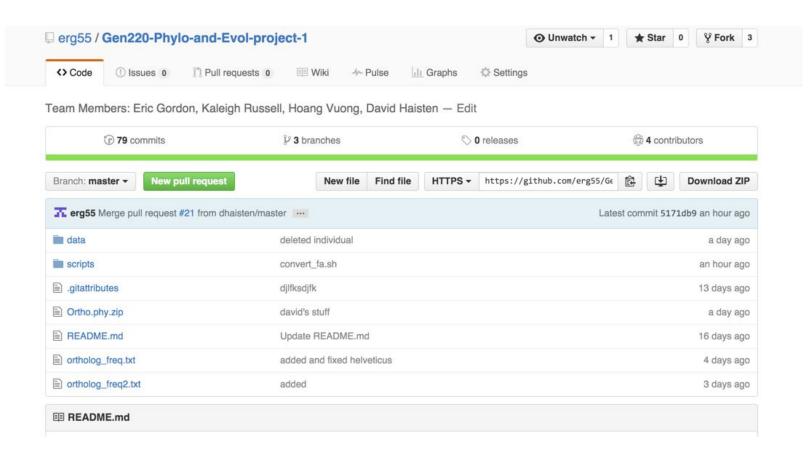
Filter for orthologs only present or with many paralogs only in bee associates

Unique orthologs (only in one genome)

Analyze Gene
Ontology terms
to determine
enrichment of
certain
functions

## GitHub Repo

- Used GitHub repo to collaborate and share code and small data files
- Was not as straightforward as expected. Still slightly confused.

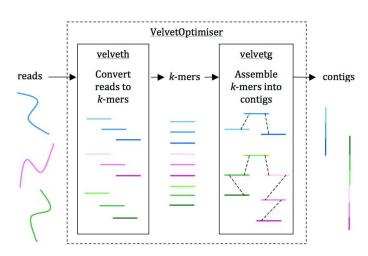


## Assembly (Velvet) > Annotation (Prokka)

- Script for submitting array job to velvet per paired end Illumina data file for each genome.
- Velvet de bruijn graph assembler based on k-mers
- Prokka takes contigs from Velvet and rapidly annotates them using BLAST and HMMER3
- Feed newly assembled proteomes from Prokka into OrthoMCL.

#### ....In progress

Having trouble decoupling interspersed paired end data from SRA into two files (potentially because of new fastq format)





### OrthoMCL

- Script to loop through fasta files organized in folders and rename by taxon and filtering out poor quality protein sequences (very short or with stop codons) with OrthoMCL and combine rest into one file
- Make blast db and Blast all-vs-all of proteomes. Keeping only hits with e-values less than e-5 and length >50%
- Load results into SQL database.
- Find orthologs, inparalogs, and co-orthologs through a series of 20 steps that create as many intermediate tables in MySQL
- MCL (Markov chain clustering) program
- Scripts for pulling out single copy orthologs and sequence fasta.

#version if can't get array job to work module load orthomcl # 38 files to be parallelized unset folder for i in {1..37} folder=\$(sed -n -e "\$i p" arraylist.txt) # folders must be a three or four letter unique abbreviation for the taxon, fasta file is in folder for fastafile in ./"\$folder"/\*.fasta\* orthomclAdjustFasta \$folder " \$fastafile" 2 from organisms of interest All-against-all BLASTP Between Species: Within Species: Reciprocal best similarity pairs Reciprocal better similarity pairs Putative orthologs (recent) paralogs Similarity Matrix (normalized by species) Markov Clustering Ortholog groups with (recent) paralogs

## Single copy orthologs

- 420 single copy orthologs (SCO) found.
- Accidental inclusion of proteomes of multiple strains per species for a couple of taxa when downloaded from genbank...removed from SCO assessment but then reincluded so these taxa may have artificial duplicate orthologs from each strain (will redo with newly annotated)
- First analysis containing all sequenced genomes of bee associates.
- More than previous studies which included distantly related outgroups (303; Ellegaard et al. 2015) but less than some others with either fewer taxa or more closely related taxa (530, 790; Tamarit et al. 2015).

Ellegaard, K. M., Tamarit, D., Javelind, E., Olofsson, T. C., Andersson, S. G., & Vásquez, A. (2015). Extensive intra-phylotype diversity in lactobacilli and bifidobacteria from the honeybee gut. *BMC genomics*, *16*(1), 284.

Tamarit, D., Ellegaard, K. M., Wikander, J., Olofsson, T., Vásquez, A., & Andersson, S. G. (2015). Functionally Structured Genomes in Lactobacillus kunkeei Colonizing the Honey Crop and Food Products of Honeybees and Stingless Bees. *Genome biology and evolution*.

OG1.5_1049.	fasta	Dec 1, 2015, 5:14 PM
OG1.5_1060.	fasta	Dec 1, 2015, 5:14 PM
OG1.5_1061.	fasta	Dec 1, 2015, 5:14 PM
OG1.5_1062.	fasta	Dec 1, 2015, 5:14 PM
OG1.5_1064.	fasta	Dec 1, 2015, 5:14 PM
OG1.5_1066.	fasta	Dec 1, 2015, 5:14 PM
OG1.5_1067.	fasta	Dec 1, 2015, 5:14 PM
OG1.5_1070.	fasta	Dec 1, 2015, 5:14 PM
OG1.5_1072.	fasta	Dec 1, 2015, 5:14 PM
OG1.5_1073.	fasta	Dec 1, 2015, 5:14 PM
OG1.5_1075.	fasta	Dec 1, 2015, 5:14 PM
OG1.5_1078.	fasta	Dec 1, 2015, 5:14 PM
OG1.5_1081.	fasta	Dec 1, 2015, 5:14 PM
OG1.5_1083.	fasta	Dec 1, 2015, 5:14 PM
OG1.5_1084.	fasta	Dec 1, 2015, 5:14 PM
OG1.5_1085.	fasta	Dec 1, 2015, 5:14 PM
OG1.5_1088.	fasta	Dec 1, 2015, 5:14 PM
OG1.5_1089.	fasta	Dec 1, 2015, 5:14 PM
OG1.5_1091.	fasta	Dec 1, 2015, 5:14 PM
OG1.5_1093.	fasta	Dec 1, 2015, 5:14 PM
OG1.5_1094.	fasta	Dec 1, 2015, 5:14 PM
OG1.5_1095.	fasta	Dec 1, 2015, 5:14 PM
004 5 4000	t	D 4 0045 F-44 DM

>lcl|Lbre|741040218 unnamed protein product

MPRVKGGTVTRARRKKVLKLAKGYRGSKHRLFKVAKDQVMKGRQYAFRDRKATKRNFRKLWIARINAAARMNGLSYSKL

1 -1 LL C LLACTTOTTO CO

>lcllLfru1497707398 unnamed protein product

MPRVKGGTTTRNRRKRVLKLAKGYRGAKHRLFKTAKDQVMKSQEYAFRDRRANKGNFRKIWIARINAATRNNGLSYSKF HGLKLANIDMNRKMLADLAVNDADAFSALAEKAKAALK

>lcllLfru|948626790 unnamed protein product

MPRVKGGTTTRNRRKRVLKLAKGYRGAKHRLFKTAKDQVMKSQEYAFRDRRANKGNFRKIWIARINAATRNNGLSYSKF HGLKLANIDMNRKMLADLAVNDADAFSALAEKAKAALK

>lcl|Fhon|927065203 unnamed protein produc

MPRVKGGTVTHARRKRVLKEAKGYREGKHSLFKTAKDQVMKSREYAFRDRRANKGNFRRLWIARINAAARMNGLSYSKLM HGLKLSNTFMNRKMLADLAVNDEKAFASLAFTAKKATK

>lcl|LAan|927072621 unnamed protein product

MPRVKGGTVTHARRKRVLKEAKGYREGKHSLFKTAKDQVMKSREYAFRDRRANKGNFRRLWIARINAAARMNGLSYSKLM

>lcl|LAce|927069417 unnamed protein product

MPRVKGGTVTHARRKRVLKEAKGYREGKHSLFKTAKDQVMKSREYAFRDRRANKGNFRRLWIARINAAARMNGLSYSKLM HGLKLSNIEMNRKMLADLAVNDEKAFASLAETAKKAIK

>lcl|LAdo|937533902 unnamed protein produc

MPRVKGGTVTHARRKRVLKEAKGYREGKHSLFKTAKDQVMKSREYAFRDRRANKGNFRRLWIARINAAARMNGLSYSKL HGLKLSNIEMNRKMLADLAVNDEKAFASLAETAKKAIK

>lcl|LAfl|927072363 unnamed protein product

MPRVKGGTVTHARRKRVLKEAKGYREGKHSLFKTAKDQVMKSREYAFRDRRANKGNFRRLWIARINAAARMNGLSYSKI

>1c1 || Ako | 927974438 uppgmed protein produ

MPRVKGGTVTHARRKRYLKEAKGYREGKHSLFKTAKDQVMKSREYAFRDRRANKGNFRRLWIARINAAARMNGLSYSKLM HCLYLSNTENMIDWH AN LAVADEYAEASI AETAYYATY

>lcl|LAla|927077663 unnamed protein product

MPRVKGGTVTHARRKRVLKEAKGYREGKHSLFKTAKDQVMKSREYAFRDRRANKGNFRRLWIARINAAARMNGLSYSKLM HGLKLSNIEMNRKMLADLAVNDEKAFASLAFTAKKATK

slclllamy | 489723002 unnamed protein product

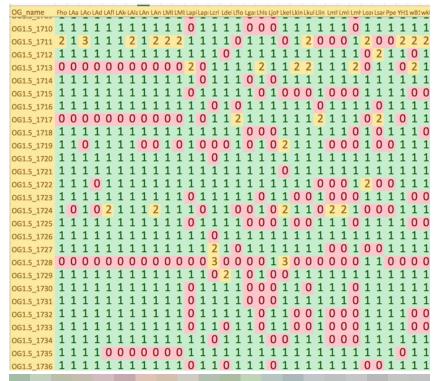
MPRVKGGIVTRKRRKKVMKLAKGYRGAKHMQFKAASTQLFVSYKYAFRDRRRRKSEFRKLWIARINAAARQNDISYSKLM HGI KI AGVDMNRKMI ADTAYNDSKTFADI AFTAKKAI N

>1c1|| Ani | 927976139 unnamed protein produc

MPRVKGGTVTHARRKRVLKEAKGYREGKHSLFKTAKDQVMKSREYAFRDRRANKGNFRRLWIARINAAARMNGLSYSKLM

## Additional OrthoMCL

- Cluster taxa based on similarity in number of shared ortholog for different ortholog groups?
- Define clades and look only within clades?
- Used custom script to pull single copy orthologs.
   Not simple to modify to pull out ortholog groups with more complex patterns.
- Scripts in development to parse out unique (might be easy) and other targeted genes by clade e.g., only present within individual bee associates (harder).





## Gene Ontology (GO)

- Annotation information wiped out after OrthoMCL.
- Could use Biopython tools to retrieve again with accession number? Potentially, then couple gene
   identity with Uniprot to get GO terms to find enriched categories in unique bee associates orthologs
- Reach goal.

## OrthoMCL output — AA Alignments

 420 orthologs from raw OrthoMCL output needed to be converted into 420 individual alignment files and 1 Supermatrix

Problem: Duplicate taxa

Problem: OrthoMCL file headers

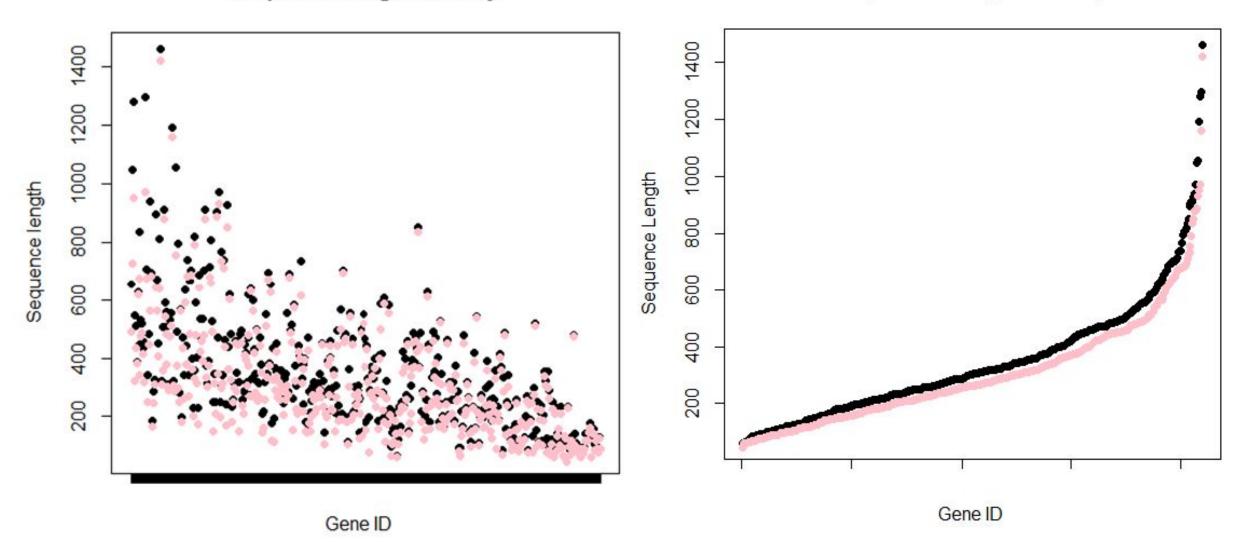
Solution: trimAL 2, MAFFT v7.266, FASconCAT-G, seqmagick

## OrthoMCL output — AA Alignments

- Single "Pipeline" written for conversion of 420 orthologs from raw OrthoMCL output into 420 individual alignment files and 1 Supermatrix
- Solution: trimAL 2, MAFFT v7.266, FASconCAT-G, seqmagick
- Installed on Mac OS X: requires biopython, GNU version of SED, Homebrew makes life easy
- Simple Unix loops

#### Sequence length overlay

#### Sequence Length Overlay



## OrthoMCL output — AA Alignments



- Duplicate taxa? No problem, seqmagick
- Need individual gene alignments converted from fasta to phylip? seqmagick
- **FASconCAT-G**, <u>indispensible versatile tool</u>: concatentation, translation, back translation, exclusion of 3rd codon positions, number of parsimony informative sites, file conversion, partition files...ideal for analysis pipelines...

## Phylogenetic Analyses

- PartitionFinder: Used for model test
- Partitioned Supermatrix: 420 partitions with individual AA substitution models
- Unpartitioned Supermatrix
- 420 Amino Acid based gene trees reconstructed via RAXML
- Gene tree based coalescent analyses via ASTRAL II

## Coalescent Hypothesis

Quartet score: 1789445

Normalized quartets: 0.92

L. kunkeei clade

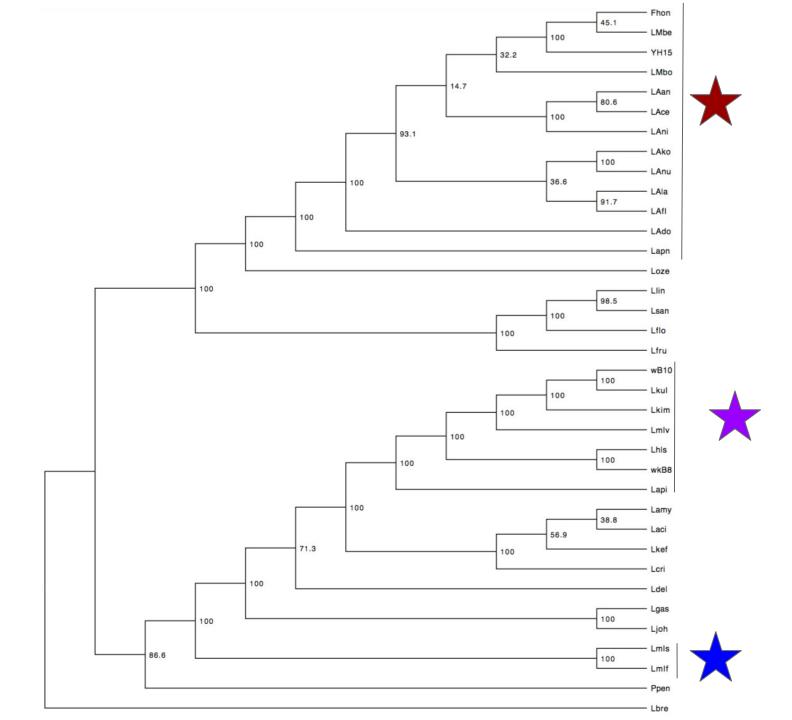


Firm 5 clade

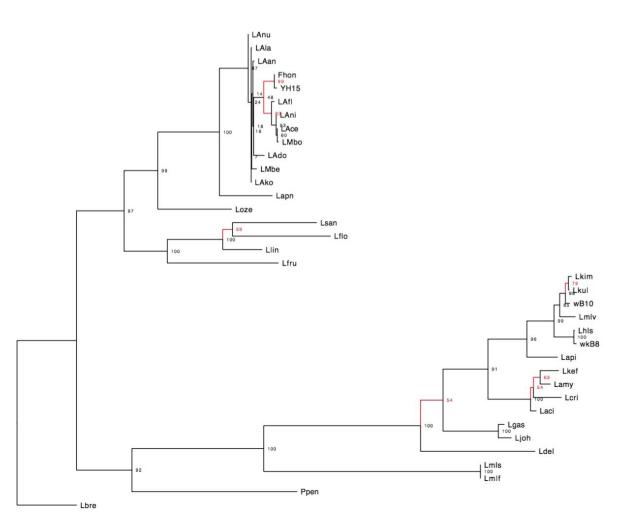


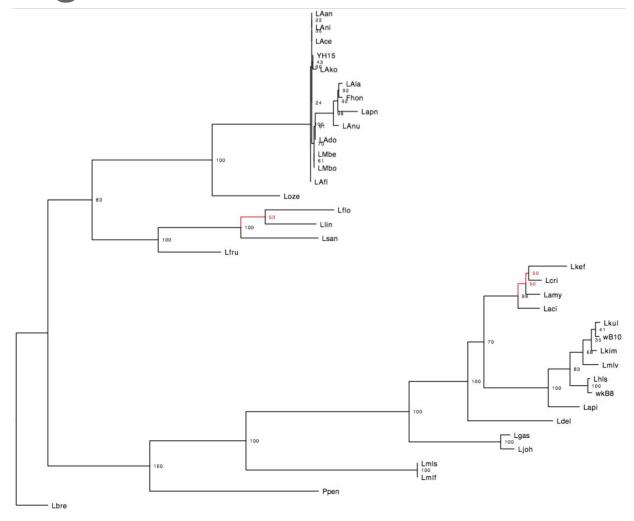
Firm 4 clade





## Individual Gene Trees: Low Incongruence?





## Nucleotide Analysis: The problem and starting point

- Starting point: Protein Sequences from Bioproject page of the chosen Lactobacillus taxon for analysis
- Fed into OrthoMCL
- Output: Protein Sequences sorted by ortholog group with GI #
- Problem: GI# record of a protein sequence entry provides ascension number of origin sequence, this origin sequence is only the contig or scaffold that contains the sequence coding the protein, and not the actual sequence

## From Protein Sequences to Nucleotide Sequences (Retaining Ortholog Group Organization)

>Lactobacillus aci (489644671) unnamed protein product
MAYQALYRKWRPRTFDSVIGQEAITDTLKNAIKRGKVSHAFLFAGPRGTGKTSCAKIFAK

Orthologs organized by group; one entry from each taxa ('awk' and 'sed')



499573729,58337864,503203834,503407681,499988013,564,497708702,948625644,927065584,927073764,9270704558088,927076921,937537498,797157825,927064882,5750007160491,41582892,503619612,797154153,797151167,9488797156644,797152894,948850649,345504528,116103593,729,58337864,503203834,503407681,499988013,5052872338702,948625644,927065584,927073764,927070456,9375337076921,937537498,797157825,927064882,575008684,311,41582892,503619612,797154153,797151167,948967592,7

All entries parsed down to just GI, then converted to comma separated values using:

```
with open('noline.fasta.new') as f:
    pepid =[]
    for line in f:
        line = line.strip()
        pepid.append(line)
```

## From Protein Sequences to Nucleotide Sequences: NCBI Entrez in Biopython, *Entrez Direct*

```
CDS 1..432
/gene="vanY"
/locus_tag="LBA1603"
/coded_by="complement(NC_006814.3:1596356..1597654)"
/note="serine-type_D-Ala-D-Ala_carboxypeptidase"
/transl_table=11
/db_xref="GeneID:3251454"
```

Using GI as input; feed into
Biopython and Efetch code
using Entrez package in
Biopython to pull out Genpept
records



#### >Lactobacillus acidophilus NCFM

ATGGTTTTTAGTAAAAAAATAAAACGGACATTAATTAGTCTTGTTGCTTTAGTTTCTTTA
GTTTCTTGTGGTGCAGTATTTACAACACCGGTTAGTGCAGATACATCAAGTAGTTATCGC
AATAATGAAGTGAATTTAGATGTTAAATCTGCAATTGCAATTGATAGTAATTCGGGGCAA
ATTTTGTATGCTAAAAAATGCTGATAAGACTTTACCAATTGCTTCAATGACAAAGTTAATT
ACAGTTTATTTAACTTTAAATGCAATTAAAAAATAAAAAATTATCTTGGAATCAAAAGGTG
AAGCCAACTGCTTCAATTGTAAAAGTAGCTAATAATGCGGAATATTCAAATGTACCGCTT
AAGATGGGGCCATTCTTATACTATTCGTCAGCTTTATCAAGCAACTTTAATTGAATCAGCT
AATGGGGCCGCAATGCTTTTGGGCCAAACTATTGCTGGTTCACAAAAGAAATTTATTGAT
CAAATGCGTGCCCAAGTTAAAAAAATGGGGGGATTGAAGATGCCGAGATTTATACGGCATGT
GGTTTACCTAATGGTAATGTAGGTAAAGATGCCTATCCTGGTGTAAAATAAGAATGCTGAA

#### PAML analysis to come later!

Utilize genpept parser program in Biopython(Pipermail emailing list):

Pulls out Nucleotide ascension number from "CDS" feature in record
Pulls out Sequence ranges and parses down the entry
Labels the header of sequence based off elements of the Genpept records

## Short discussion

- Current OrthoMCL Used: "All or nothing approach"
  - Of the orthologs found, most if not all are primarily housekeeping genes
- High levels of conservation due to analyses so far limited to only housekeeping genes

## Future Directions (To-Do)

- Inclusion of raw genomes into analysis
  - Comparison of annotation quality
- Ortholog Nucleotide Sequence alignment using aligned protein sequence (backtranslation alignment)
- Feed nucleotide alignment for tree constructions, by individual ortholog group or concatenation
- Nucleotide/Protein alignment comparison
- dN/dS analysis of ortholog group(s) of interest

## Future Directions (Out of reach)

- Analysis of Unique Ortholog groups by taxa
  - Or by clade of taxa or by group of taxa's environmental niche
  - Includes: dN/dS analysis of ortholog group(s) of interest
- Gene Ontology analysis by taxa/clade
- Horizontal Gene Transfer Detection tests via topology

## Acknowledgements

Jordan Hayes - for assistance with setting up MySQL database, and advice on using the cluster and running OrthoMCL

Jason for advice, help with scripts and qsub jobs.

"Peter" and Animesh Agrawal - Biopython code for acquiring sequence from a given Genpept record, accessed from Biopython "pipermail" mailing list archive