

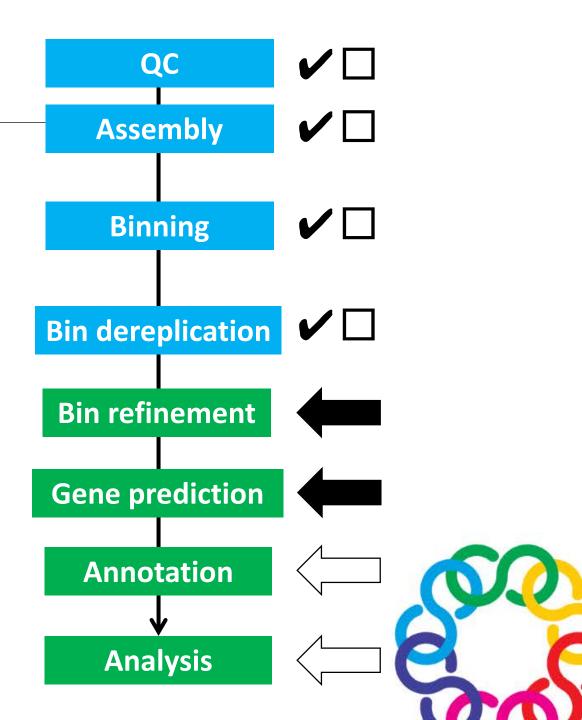
Day 3

Bin refinement Gene prediction Gene annotation



Day overview

- Goals:
 - Bin refinement
 - Gene prediction
 - Annotation
 - Start analysis

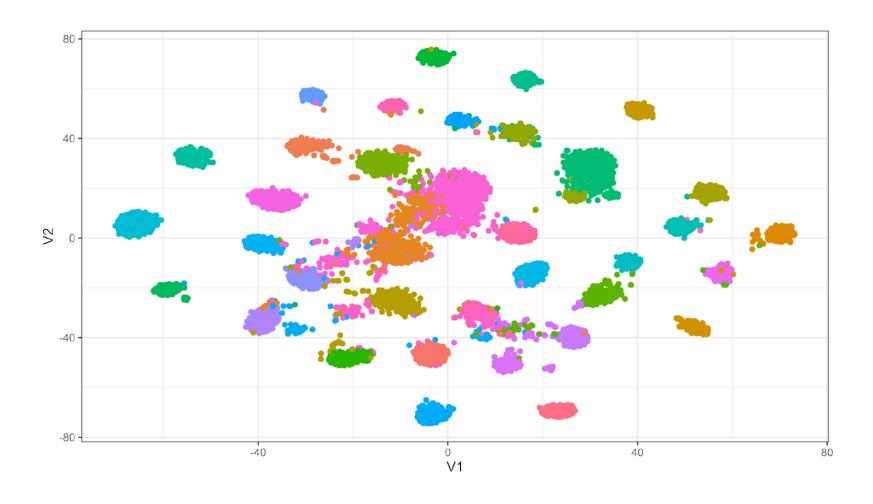


Bin refinement



VizBin

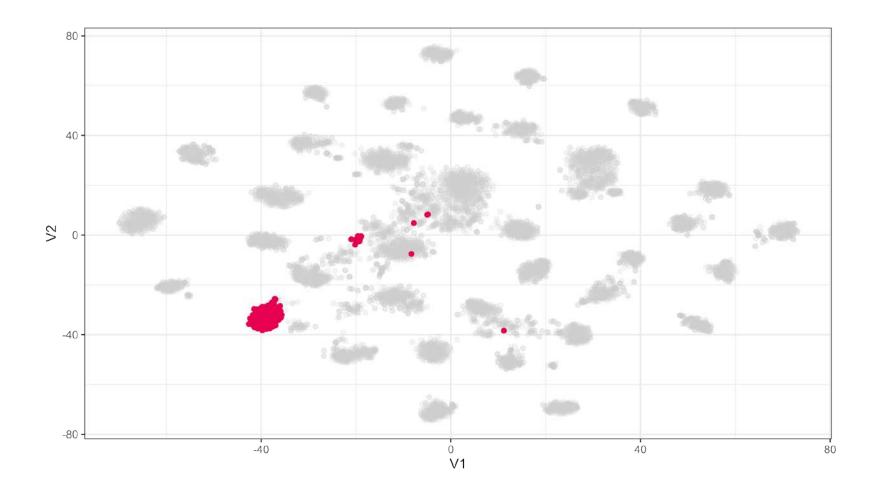
Inspect bin assignments





VizBin

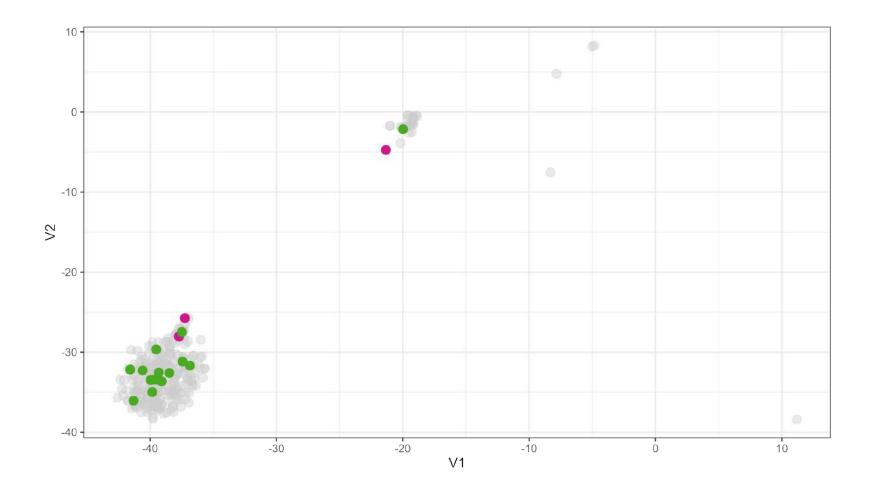
• Use graphical user interface to assign bins or reassign contigs





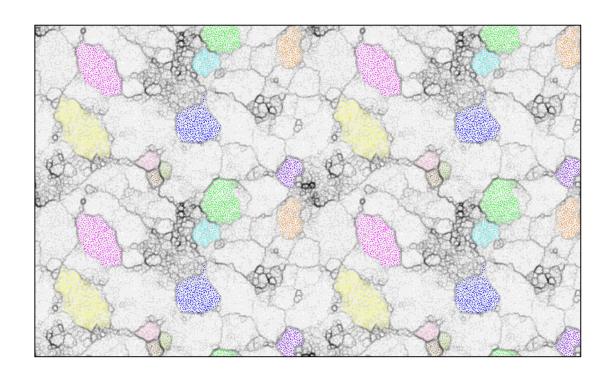
VizBin

• Identify contigs with unstable placement



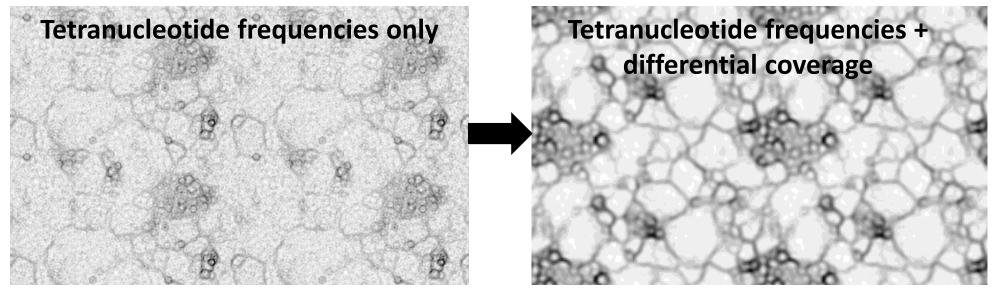


- Emergent Self Organizing Map (ESOM)
- esomana: http://databionic-esom.sourceforge.net/user.html





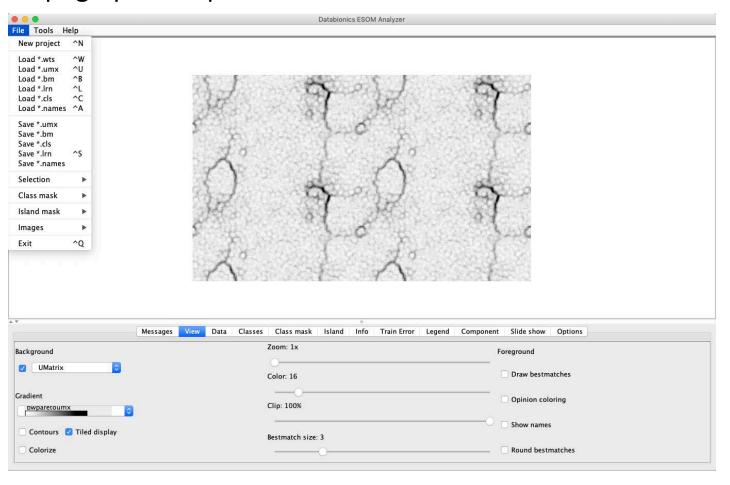
• Flexible: use whatever data you want, e.g.: tetranucleotide frequencies, coverage, both



Indistinct bin boundaries between highly similar genomes

Clear bin boundaries between highly similar genomes using spatial gradient data

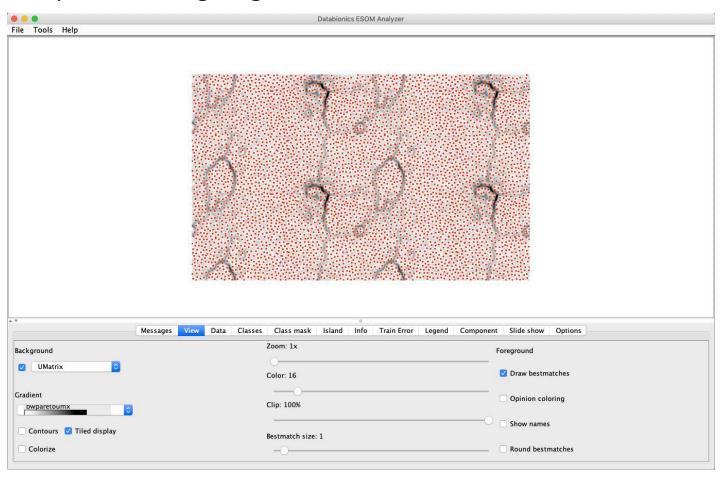
Topographic map of clusters



- Uses graphical user interface
- Must supply own prepared data (e.g. pre-calculate tetranucleotide frequencies)
- Dark lines = bin boundaries
- Strong lines = strong bin divisions



Map with contig fragments shown in red

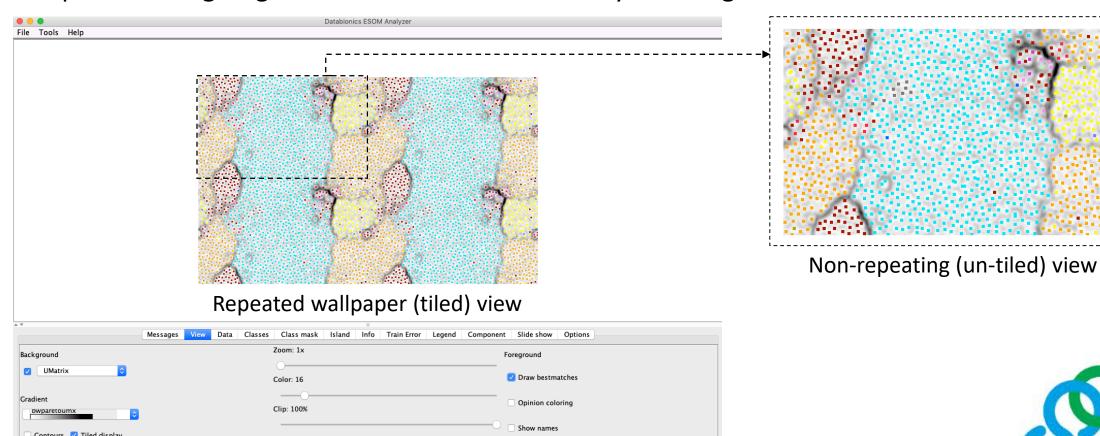


- Uses graphical user interface
- Must supply own prepared data (e.g. pre-calculate tetranucleotide frequencies)
- Dark lines = bin boundaries
- Strong lines = strong bin divisions



Colorize

Map with contig fragments shown and coloured by bin assignment





Round bestmatches

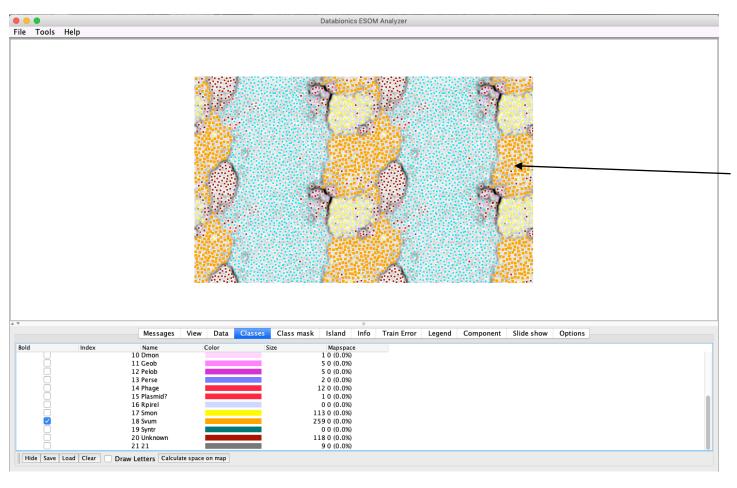
Map with contig fragments shown and coloured by bin assignment



Like VizBin, bins are selected by manually drawing around boundary



Map with contig fragments shown and coloured by bin assignment



- Select pre-assigned bin to highlight contig fragments
- Choose/change bin colours
- Example: Sulfurovum bin highlighted



Task: Work with VizBin

Use VizBin to:

- Prepare input files for VizBin
- Project high-dimensional data down into a 2D plot
- Pick refined bins





Gene prediction and annotation

- Genome prediction annotation is the process of attaching biological information to sequences
- It consists of three main steps:
 - Gene prediction
 - Prediction of protein sequences
 - Functional annotation: Attaching biological information to these elements



Aim:

To identify regions of genomic DNA that encode putative genes present

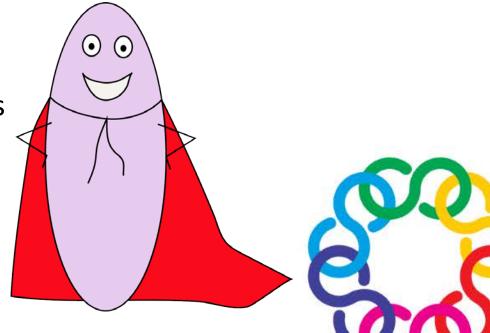
in high quality genomes

About 1/1000th of a human genome in size, but with only 1/10th less coding DNA sequence

→ 100 x more power packed!!!

Prokaryote genomes:

- High gene density
- Genes = continuous stretches of coding DNA
- Absence of introns in the protein coding regions



Gene finding algorithms for prokaryotes

- Homology:
 - Search by sequence similarity to homologous sequences
 - Based on the assumption that functional regions are more conserved evolutionarily than non-functional regions
- Ab initio:
 - Search by content: find genes by statistical properties that distinguish protein-coding DNA from non-coding DNA
 - Search by signals/sites, e.g. promoters, start and stop codons



Homology: Sequence similarity searches

- Finding similarity in gene sequences between expressed sequence tags (ESTs),
 proteins, or other genomes to the input genome
- Local alignment:
 - BLAST family tools: https://blast.ncbi.nlm.nih.gov/Blast.cgi
 - Global alignment
 - GeneWise: https://www.ebi.ac.uk/Tools/psa/genewise/



Ab initio search by content algorithms:

- Markov Models
- **Dynamic Programming**
- Linear discriminant analysis
- Linguist methods
- Neural Network



Ab initio search by content: Markov Model Based Algorithms

- Most widespread algorithms for gene finding in prokaryotes are based on Markov Models
- Aim is to capture compositional differences among coding regions, "shadow" coding regions (coding on the opposite DNA strand) and non-coding DNA



Markov Model Based Algorithms: Glimmer

- https://ccb.jhu.edu/software/glimmer/
- Interpolated Markov model (IMM) DNA discriminator
- Log-likelihood that a given interval on a DNA sequence was generated by a model of coding versus non-coding DNA



Markov Model Based Algorithms: GeneMark/GeneMarkHMM/MetaGeneMark

- http://exon.gatech.edu/GeneMark/
- GeneMark is a family of gene prediction tools
- Genomic sequences can be analysed either by the self-training program <u>GeneMarkS</u>
 (sequences >50 kb) or using Heuristic Models by <u>GeneMarkHMM</u>
- Pre-trained model parameters are available for many species
- Metagenomics sequences can be analysed with <u>MetaGeneMark</u>



Prodigal (PROkaryotic Dynamic Programming Genefinding ALgorithm)

- http://compbio.ornl.gov/prodigal/
- Based on <u>Dynamic Programming</u>, not Markov Models
- Gene-finding algorithm for prokaryote genomes developed to predict translation initiation sites more accurately.
- High accuracy in high GC content genomes
- Tends to predict longer genes rather than more genes (minimising number of false positives)

Prodigal for metagenomics:

- Use anon (meta) mode with metagenomic data (or short sequence data)
 - Copes with diverse genomes
 - Unlike normal mode, it does not attempt to study the input sequence,
 and predict based on these assumptions
 - Uses pre-calculated training files, and predicts genes based on the best results
- Alternatively, use normal mode on each individual genome bin



Prodigal for metagenomics:

- Caveat: unusual genetic codes
 - First uses genetic code 11 (stop codons TAA, TGA, TAG)
 - If genes are too short, uses alternative code 4 (TGA not a stop codon)
 - Will not try code 25, but will issue warning if genes are short
 - Must manually select code 25



Prodigal for metagenomics:

- Important note:
 - Prodigal predicts coding DNA sequence ONLY
 - Provides nucleic acid (.fna) and amino acid (.faa) files
 - DOES NOT identify other features (e.g. rRNA, tRNA)
 - Combine with other prediction tools



Predicting RNA features and non-coding regions:

- MeTaxa2: predicts ribosomal RNA sequences in a genome
- Aragorn: predicts tRNA and tmRNA sequences



Predicting protein coding sequences in unassembled (short) reads

- FragGeneScan:
 - Tuning parameters for short sequences (and hence incomplete genes)
 - Model sequence error



Task: Gene prediction

Preparing data for gene prediction

- Identify and prepare input files for each gene prediction tool (Prodigal, FragGeneScan, MeTaxa2 and Aragorn)
- 2. Configure parameters for gene prediction

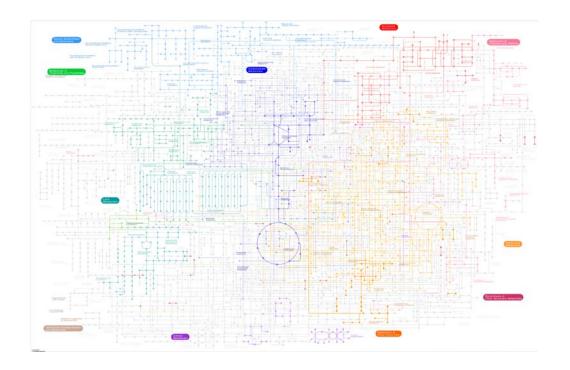
Perform gene prediction

1. Run each job directly from the node (no slurm script required)





- Genome annotation attempts to predict gene function
- Predicted genes or protein sequences are compared against a curated set of reference sequences for which function is known, or is strongly suspected





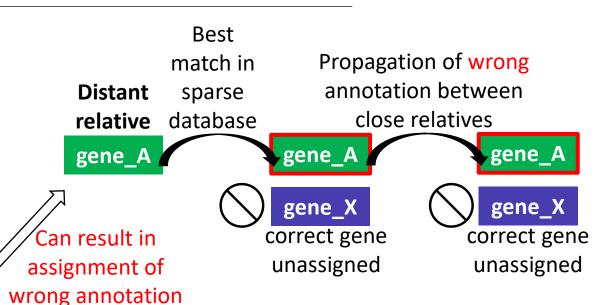
Caveat:

 Annotations are dependent on the reference database

Environmental genomes can have:

Genes with distant homology matches to unrelated taxa

 Large numbers of "hypothetical" gene annotations (= genes of unknown function)





Caveat:

- Annotations are "advice"
- Automated annotations often need to be manually curated
- Interrogate if: expected functional gene is missing from annotations
- Gene synteny is a useful for missing gene discovery, e.g.:
 - check genes co-located in operons for putative functions
 - check for operon truncation (due to contig break)



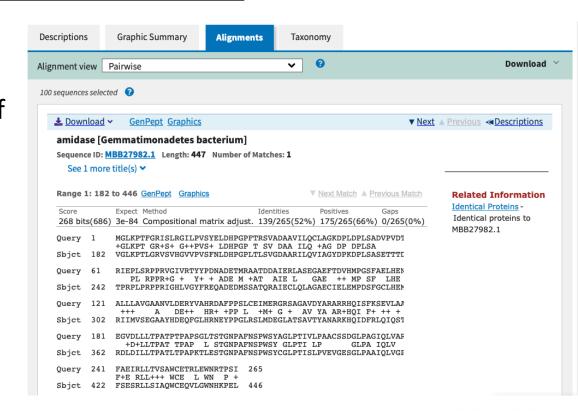
There are two main ways to perform gene annotation with protein sequences:

- BLAST-like gene annotation
- Domain annotation



BLAST-like gene annotation

- Pairwise local alignment between the gene of interest (query sequence) and the sequences in the database (target sequence)
- Tools:
 - BLAST: web-based and stand alone (usually too slow for metagenomics)
 - <u>USEARCH</u> (64-bit): fast (subscription needed)
 - Diamond: fast





HMM-profiling of domains:

- Considers the query sequences as a collection of independently functioning protein folding domains
- Uses database of Hidden Markov models built from a collection of proteins that share a common domain
- Profiles build from statistical map of the
 - amino acid transitions (from position to position),
 - variations (differences at a position),
 - insertions/deletions between positions
- Tools: HMMer software (http://hmmer.org/)



Common functional databases

- KEGG (Kyoto Encyclopedia of Genes and Genomes) (https://www.kegg.jp)
 Very popular, each entry is well annotated, and often linked into "Modules" or "Pathways" (Full access now requires a license fee)
- COGs (Clusters of Orthologous Groups of proteins) (https://www.ncbi.nlm.nih.gov/COG/)
 Classify proteins from completely sequenced genomes on the basis of the orthology concept
- PFAM (https://pfam.xfam.org)
 Focused more on protein domains based on hidden Markov models
- TIGRfam (https://www.jcvi.org/tigrfams)
 Database of protein family definitions based on hidden Markov models



Common functional databases (continued)

• The PANTHER (Protein **AN**alysis **TH**rough **E**volutionary **R**elationships) Classification System (http://pantherdb.org)

Proteins are classified according to Family and subfamily, molecular function, biological process and pathway

- UniRef (UniProt Reference Clusters) (https://www.uniprot.org/)
 Protein clustering at different levels (e.g. UniRef100, UniRef90, UniRef50)
- BioCyc Database Collection (https://biocyc.org)
 14735 Pathway/Genome Databases (PGDBs), plus software tools
 Subscriptions are required to access most of BioCyc
- MetaCyc Metabolic Pathway Database (https://metacyc.org)
 2722 pathways from 3009 different organisms



Graphical User Interface – MEGAN

- Toolbox for interactively analyzing microbiome data.
 - Taxonomic analysis using the NCBI taxonomy or a customized taxonomy such as SILVA
 - Functional analysis using InterPro2GO, SEED, eggNOG or KEGG
 - Bar charts, word clouds, Voronoi tree maps and many other charts
 - PCoA, clustering and networks
 - Supports metadata

https://uni-tuebingen.de/fakultaeten/mathematisch-naturwissenschaftlichefakultaet/fachbereiche/informatik/lehrstuehle/algorithms-inbioinformatics/software/megan6/



Some web-based annotation tools:

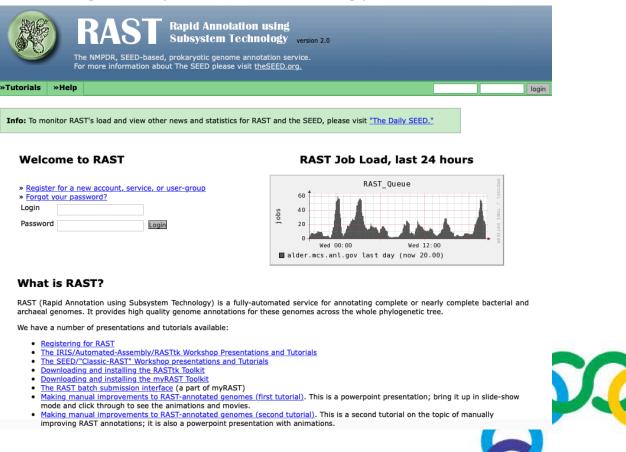
- Web BLAST (https://blast.ncbi.nlm.nih.gov/Blast.cgi)
- RAST/MG-RAST (Rapid Annotation using Subsystem Technology) Annotation Server
- KEGG Automatic annotation and KEGG mapping service
 - BLAST-Koala: BLAST search (https://www.kegg.jp/blastkoala/)
 - GHOST-Koala: GHOSTX search (https://www.kegg.jp/ghostkoala/)
 - KofamKOALA: HMM profile search (https://www.genome.jp/tools/kofamkoala/)
- <u>IMG/M</u> (The Integrated Microbial Genomes and Microbiomes)

(https://img.jgi.doe.gov)

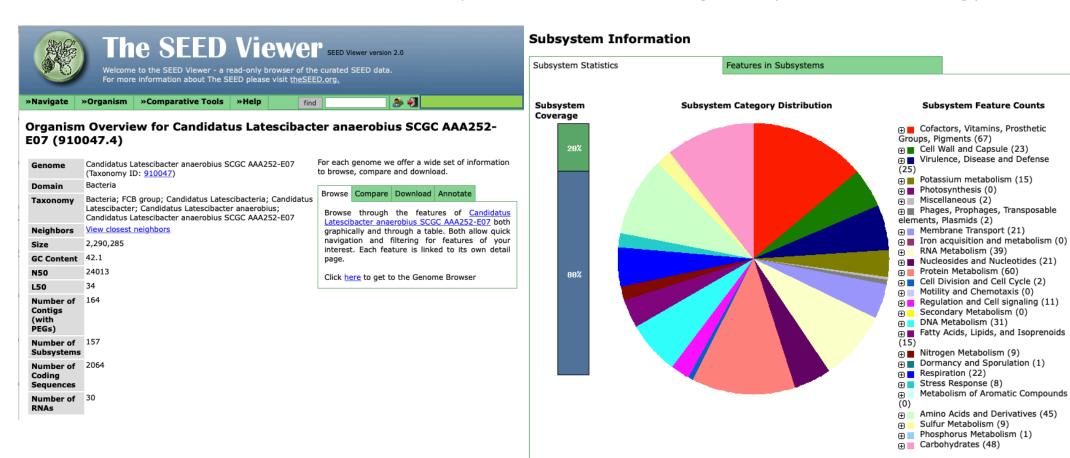


RAST Annotation Server (Rapid Annotation using Subsystem Technology):

- Fast annotation (~1 genome/day)
- Can use for individual genome bins
- It works well for genomes similar to large groups of reference genomes
- As usual: requires manual curation after initial annotation



RAST Annotation Server (Rapid Annotation using Subsystem Technology)





Task: Gene annotation

Preparing data for gene annotation

- 1. Identify and prepare input files for gene annotation with Diamond
- 2. Configure parameters for gene annotation

Perform gene annotation

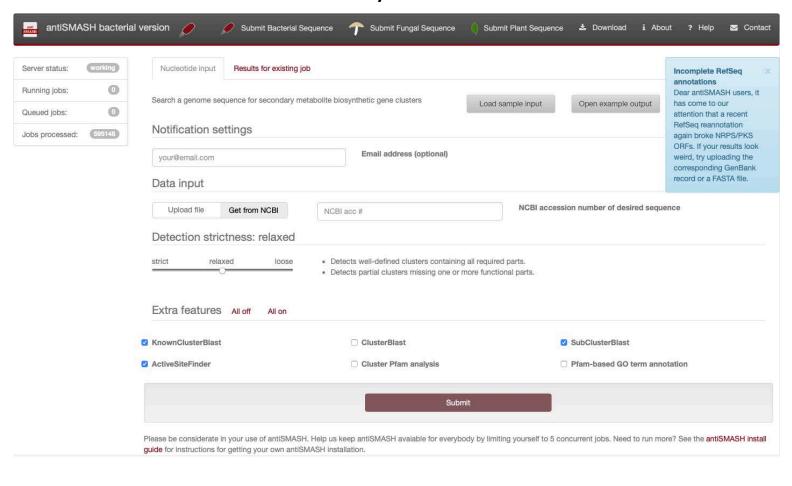
- 1. Prepare an annotation job to run under slurm
- 2. Use MEGAN to explore gene networks



Online resources and data analysis



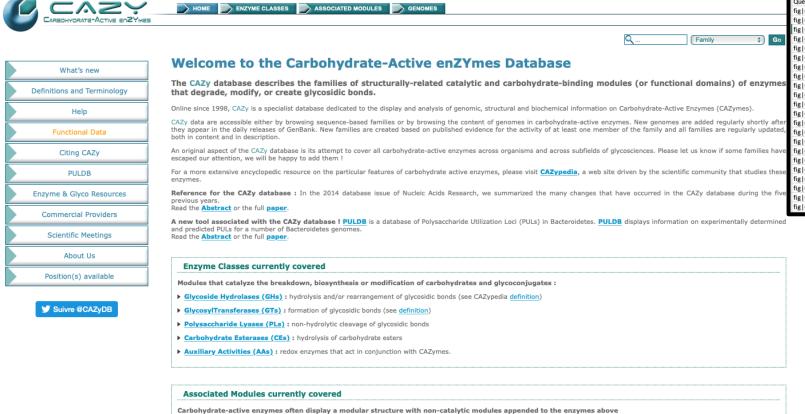
Identification of Biosynthetic Gene Clusters with antiSMASH



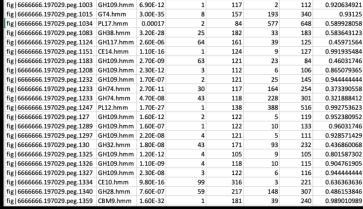




Identification of Carbohydrate-Active enZYmes - CAZY Database



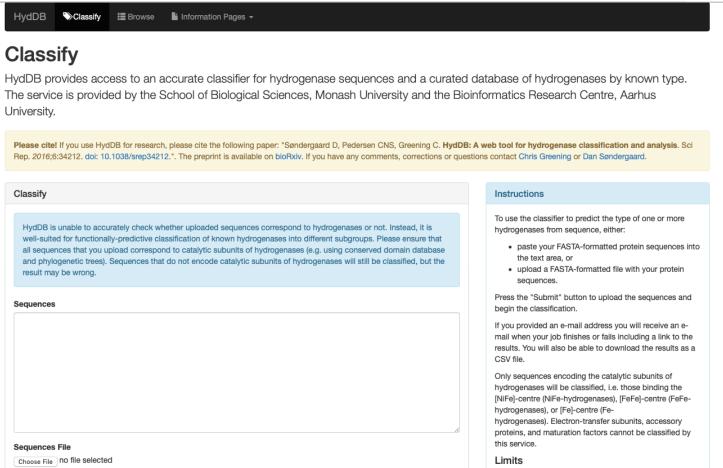
▶ Carbohydrate-Binding Modules (CBMs) : adhesion to carbohydrates



E-value Subject start Subject end Query start Query end Covered fraction



Accurate classifier for hydrogenase sequences - HydDB



https://services.birc.au.dk/hyddb/



NCBI Conserved Domain Search

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ME SEARCH GUIDE	Structure Home	3D Macromolecular Structures	Conserved Domains	Pubchem BioSystems
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Search nucleotide/protein sequence(s) for conserved domains

Individual search: https://www.ncbi.nlm.nih.gov/Structure/cdd/wrpsb.cgi
Batch: https://www.ncbi.nlm.nih.gov/Structure/bwrpsb/bwrpsb.cgi



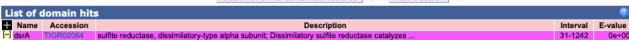




NZ_JRAA01000001.1:c722683-721433 Solemya velum gill symbiont strain WH SV_sym_Scaffold_1, whole genome shotgun sequence



View Concise Results 2



sulfite reductase, dissimilatory-type alpha subunit; Dissimilatory sulfite reductase catalyzes the six-electron reduction of sulfite to sulfide, as the terminal reaction in dissimilatory sulfate reduction. It remains unclear however, whether trithionate and thiosulfate serve as intermediate compounds to sulfide, or as end products of sulfite reduction. Sulfite reductase is a multisubunit enzyme composed of dimers of either alpha/beta or alpha/beta/gamma subunits, each containing a siroheme and iron sulfur cluster prosthetic center. Found in sulfate-reducing bacteria, these genes are commonly located in an unidirectional gene cluster. This model describes the alpha subunit of sulfite reductase. [Central intermediary metabolism, Sulfur metabolism]

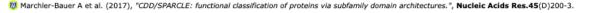
Pssm-ID: 273948 [Multi-domain] Cd Length: 402 Bit Score: 667.31 E-value: 0e+00

1 Cdd:TIGR02064	LDQLESGPWPSFISGIKRLRDEHPEERINKHTNDLLGQLEHSYETTKGYWKGGTVSVFQYGGGIIRFSEVGHAFPESKE LDQLEKGPWPSFVSEIKKTAAYRADYQVPVDPEDLLGVLELSYDERKTHWKGGIVSVFGYGGGVIGRYSDQGEKFPGVAE	
1 Cdd:TIGR02064	90 100 110 120 130 140 150 160	
1 Cdd:TIGR02064	170 180 190 200 210 220 230 240* * * * * * * * VGAARCEMSCTNEQKAHRLLVNNFTDDVHRPALFYKFKFKVSGCCNDCQNAVERADFAVIGTWRDDMNVNQDEFKAYVGR VGPARCEFACYDTLKACYELTMEYQDELHRPAFFYKFKFKFSGCPNDCVAAIARSDFAVIGTWKDDIKVDQEAVKAYIAG	
1 Cdd:TIGR02064	250 260 270 280 290 300 310 320*	
1 Cdd:TIGR02064	330 340 350 360 370 380 390 400*	
1 Cdd:TIGR02064		

Conserved Domain Search results:

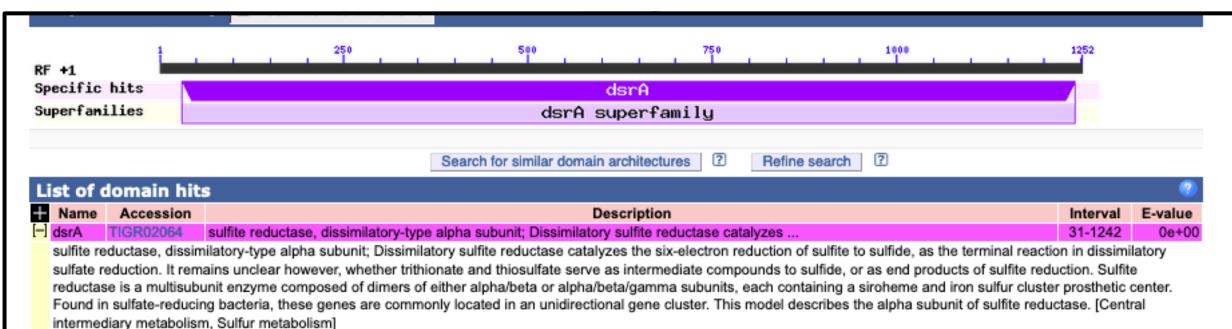
dsrA gene of Solemya velum gill symbiont strain WH





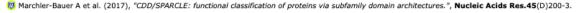




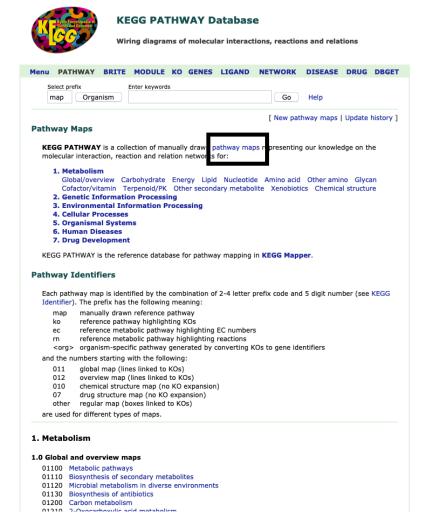


250 260 270 280 290 300 310 320		170 * *. VGAARCEMSCTNEQKA VGPARCEFACYDTLKA	HRLLVNNFT	DDVHRPALP	* YKFKFKVSG	CGNDCQNAVER	* ADFAVIGTW	.* RDDMNVNQDEF	* 'KAYVGR 250
1 331 klDTEEDWEEIVELAEEIIDFWAENALEHERCGEMIERIGLVNFLEGVGVEVDPNMVNNPRESSYIRMDGWDEEAVKWFD 410 Cdd:TIGR02064 321BAEEPYDEIKELVEKIIDWWDEEGKNRERIGETIKRLGLQKFLEVIGIEPDPQMVKEPRTNPYIFFKVEDEVPGGWDA 398 1 411 RQAE 414		KGRQHVIDNIITRCPT	NALSLNDDE	SLEVNNKDC	* VRCMHCLNV	.* VPKALHPGDDR	* GVTILIGGK	.* RTLKIGDLMGT	* VVVPFK 330
1 411 RQAE 414	-	 kloterdweeivelas	EIIDFWAEN	ALEHERCGE	* MIERIGLVNI	.* FLEGVGVEVDP	* NMVNNPRES	.* SYIRMDGWDEE	* AVKWFD 410
		RQAE 414							

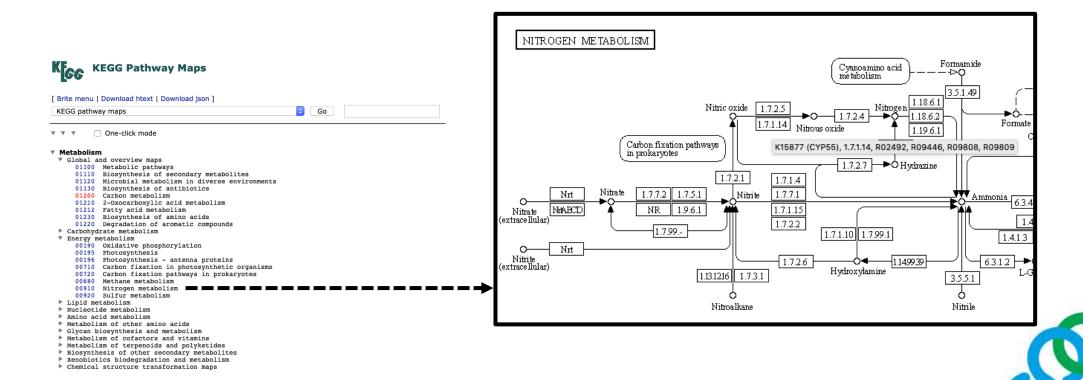
References:

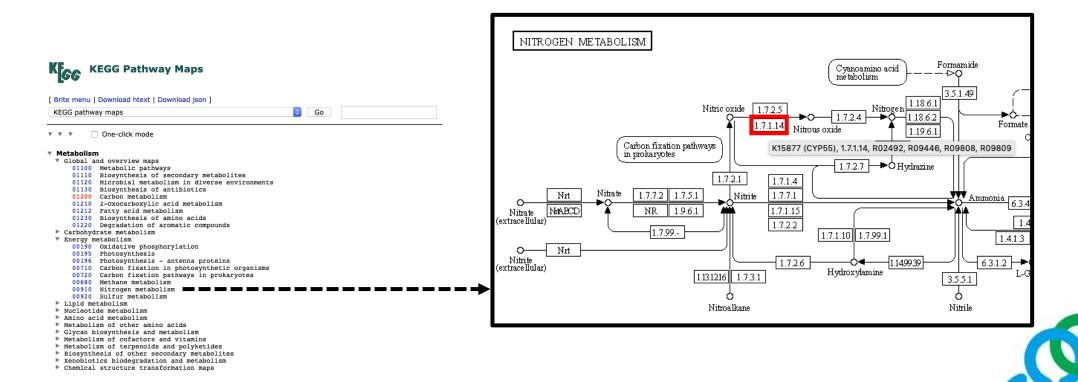


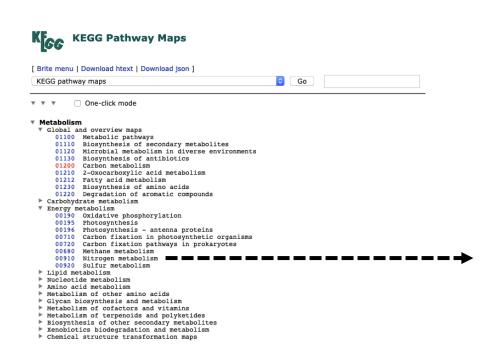




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	Global and overview maps
	01100 Metabolic pathways
	01110 Biosynthesis of secondary metabolites
	01120 Microbial metabolism in diverse environments
	01130 Biosynthesis of antibiotics
	01200 Carbon metabolism
	01210 2-Oxocarboxylic acid metabolism
	01212 Fatty acid metabolism
	01230 Biosynthesis of amino acids
	01220 Degradation of aromatic compounds
	Carbohydrate metabolism
₩ E	Energy metabolism
	00190 Oxidative phosphorylation
	00195 Photosynthesis
	00196 Photosynthesis - antenna proteins
	00710 Carbon fixation in photosynthetic organisms
	00720 Carbon fixation pathways in prokaryotes
	00680 Methane metabolism
	00910 Nitrogen metabolism
	00920 Sulfur metabolism
	Lipid metabolism Nucleotide metabolism
	NUCLEOTICE METADOLISM Amino acid metabolism
_	amino acid metabolism Metabolism of other amino acids
	Glycan biosynthesis and metabolism
	olycan blosynthesis and metabolism Metabolism of cofactors and vitamins
	Metabolism of terpenoids and polyketides
	Biosynthesis of ther secondary metabolites
	Xenobiotics biodegradation and metabolism
	Chemical structure transformation maps







KEGG	ORTHOLOGY: K15877			
Entry	K15877 KO			
Name	CYP55			
Definition	fungal nitric oxide reductase [EC:1.7.1.14]			
Pathway	ko00910 Nitrogen metabolism ko01100 Metabolic pathways ko01120 Microbial metabolism in diverse environments			
Brite	KEGG Orthology (KO) [BR:ko00001] 09100 Metabolism 09102 Energy metabolism 00910 Nitrogen metabolism K15877 CYP55; fungal nitric oxide reductase Enzymes [BR:ko01000] 1. Oxidoreductases 1.7 Acting on other nitrogenous compounds as donors 1.7.1 With NAD+ or NADP+ as acceptor 1.7.1.14 nitric oxide reductase [NAD(P)+, nitrous oxide-fo K15877 CYP55; fungal nitric oxide reductase			
Other DBs	RN: R02492 R09446 R09808 R09809 GO: 0016966			



Metacyc: experimentally curated metabolic pathways



Pathway Tools Tutorial

Sites ▼ Search ▼ Genome ▼ Metabolism ▼ Analysis ▼ SmartTables ▼ Help ▼

Search Results for dsra using database MetaCyc what is this?

Genes (3) | Proteins (3) | EC Numbers (2)

Genes Gene/Gene Product pages contain: chromosomal location of gene; depiction of its operon; link to genome browser; detailed summaries complexes); cofactors, activators, and inhibitors (for enzymes), depiction of regulon (for transcriptional regulators), protein features.

- dsrA Allochromatium vinosum
- dsrA Desulfovibrio gigas
- · dsrA Archaeoglobus fulgidus



Proteins Gene/Gene Product pages contain: chromosomal location of gene; depiction of its operon; link to genome browser; detailed summai of regulon (for transcriptional regulators), protein features.

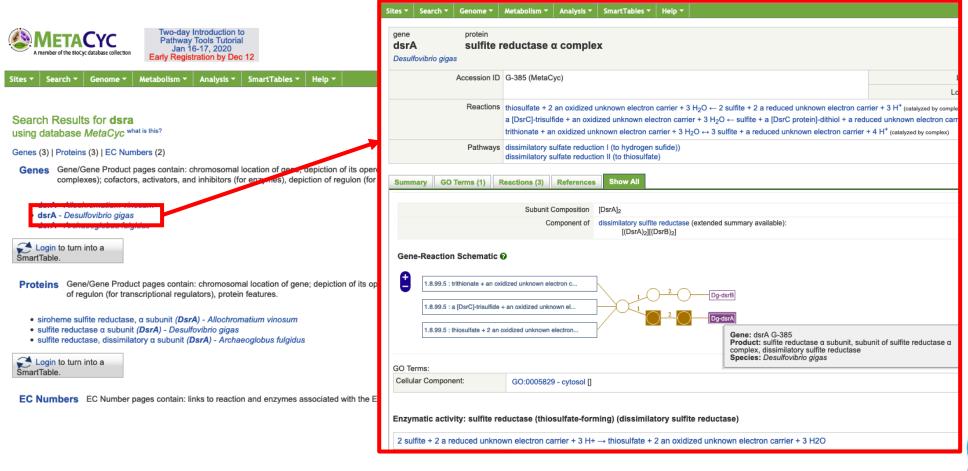
- siroheme sulfite reductase, α subunit (DsrA) Allochromatium vinosum
- sulfite reductase α subunit (DsrA) Desulfovibrio gigas
- sulfite reductase, dissimilatory α subunit (DsrA) Archaeoglobus fulgidus



EC Numbers EC Number pages contain: links to reaction and enzymes associated with the EC number in this database, names, description,



Metacyc: experimentally curated metabolic pathways





- The **PSORT** family prediction of protein localization sites in cells.
- Useful for making cell schematics!



Updates | Documentation | Resources | Contact

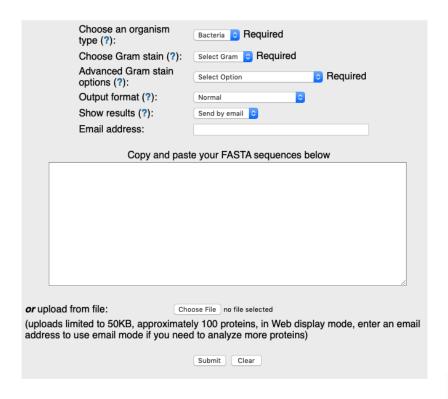
Submit a Sequence to PSORTb version 3.0.2

Based on a study last performed in 2010, PSORTb v3.0.2 is the most precise bacterial localization prediction tool available. PSORTb v3.0.2 has a number of **improvements** over PSORTb v2.0.4. Version 2 of PSORTb is maintained **here**.

You can currently submit one or more Gram-positive or Gram-negative bacterial sequences or archaeal sequences in FASTA format (?). Copy and paste your FASTA-formatted sequences into the textbox below or select a file containing your sequences to upload from your computer. Web display mode is limited to the analysis of approximately 100 proteins. For larger analyses, either enter your email address in the form below (results of up to 5000 per submission returned by email) or for even larger analyses we can help you or you can download the standalone version.

See also:

- Updates
- · Precomputed genome results
- Limitations of PSORTb v.3.0
- PSORTb User's Guide
- Docker PSORTb web service (what is docker?)
- Download standalone PSORTb
- Docker standalone PSORTb (what is docker?)





Task: Analyze data for group work

Determine which genome(s) have the following attributes, and the genetic mechanisms used for these attributes:

- 1. Denitrification (Nitrate or nitrite to nitrogen)
- 2. Ammonia oxidation (Ammonia to nitrite or nitrate)
- 3. Anammox (Ammonia and nitrite to nitrogen)
- 4. Sulfur oxidation (SOX pathway, thiosulfate to sulfate)
- 5. Sulfur reduction (DSR pathway, sulfate to sulfide)
- 6. Photosynthetic carbon fixation
- 7. Non-photosynthetic carbon fixation (Reverse TCA or Wood-Ljundahl)
- 8. Non-polar flagella expression due to a chromosomal deletion
- 9. Plasmid-encoded antibiotic resistance
- 10. Aerobic (versus anaerobic) metabolism



Summary of online resources

Resources to help interpret your data:

- KEGG: https://www.genome.jp/kegg/pathway.html
- BioCyc: https://biocyc.org/
- MetaCyc: https://metacyc.org/
- HydDB: https://services.birc.au.dk/hyddb/
- PSORT: https://psort.hgc.jp/



Optional: work with own data, or continue group task

