

## 8. Functional assignment - What are they doing?



ANAEROBICS

# Overview of this talk

What is functional assignment ?

Experimental setup and Assembly - What is important ?

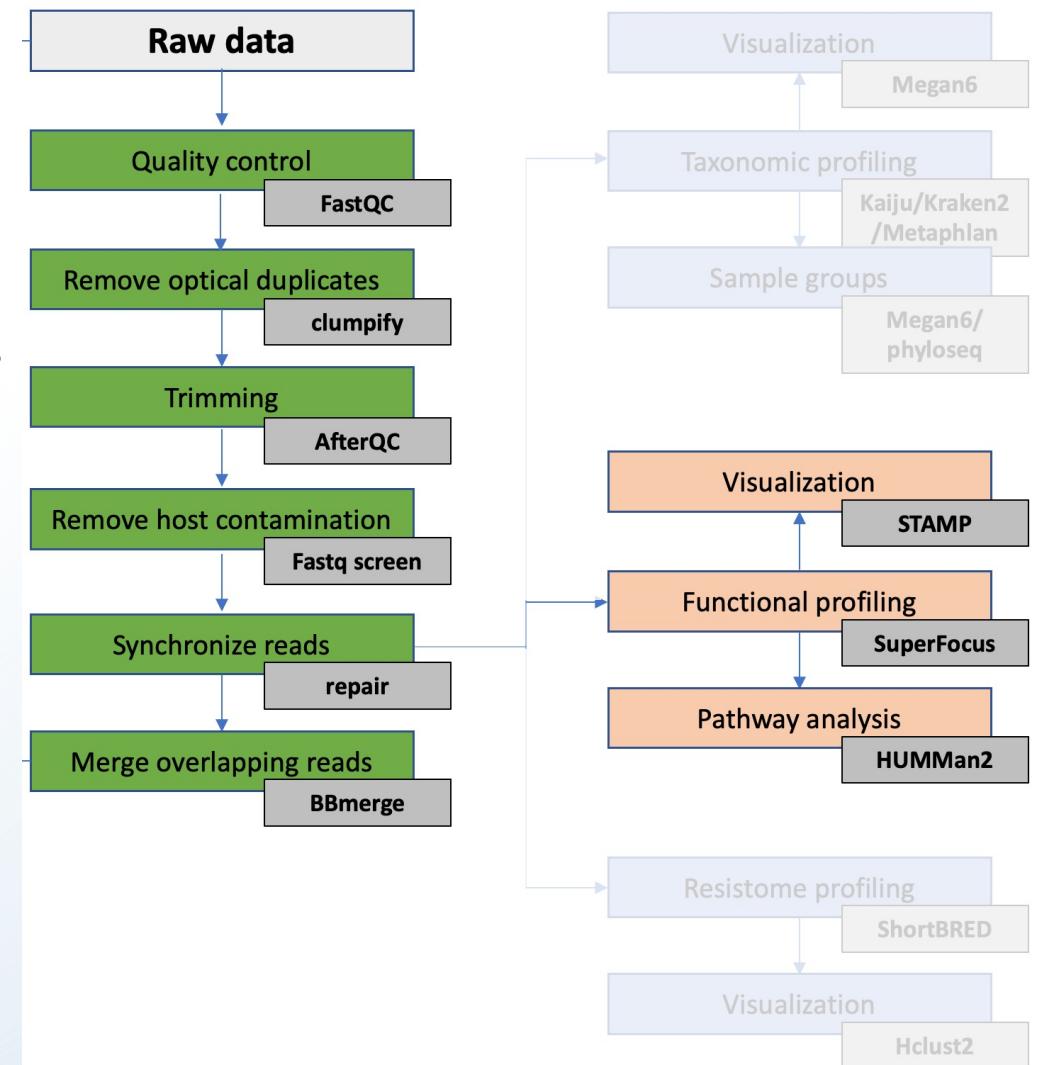
Overview of Functional assignment / Databases

Functional profiling of assembled sequences

Functional profiling of sequence reads

Visualization and comparison of functional profiles

Pathway profiling



# The humane microbiome – the genetic repertoire changes

We focus a lot on which microbes are present  
(or absent)

DNA exchange occurs between microbes, and  
can potentially alter their functional capabilities



Genes from *Zobellia*



lurk on this seaweed



linger on this food



and end up in his gut

# Functional assignment - What are they doing?

Annotation of all **available** genes

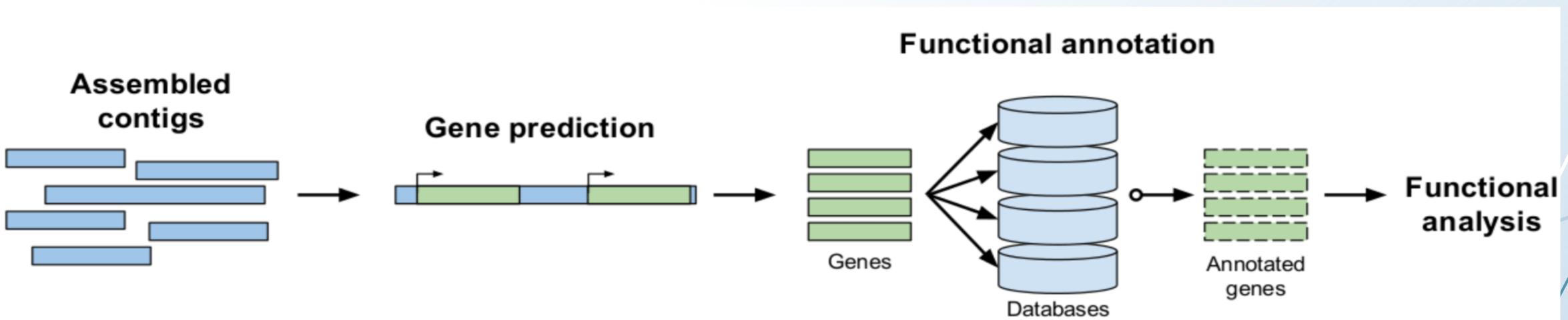
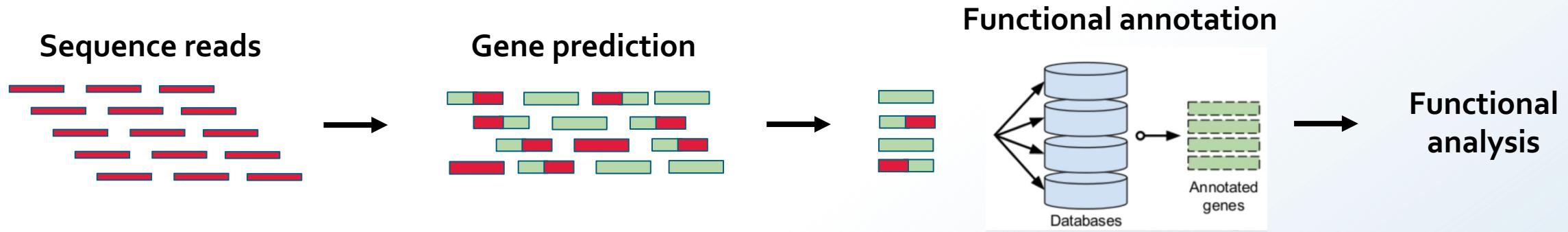
We can only see part of the picture

Provides functional overview and novel genes



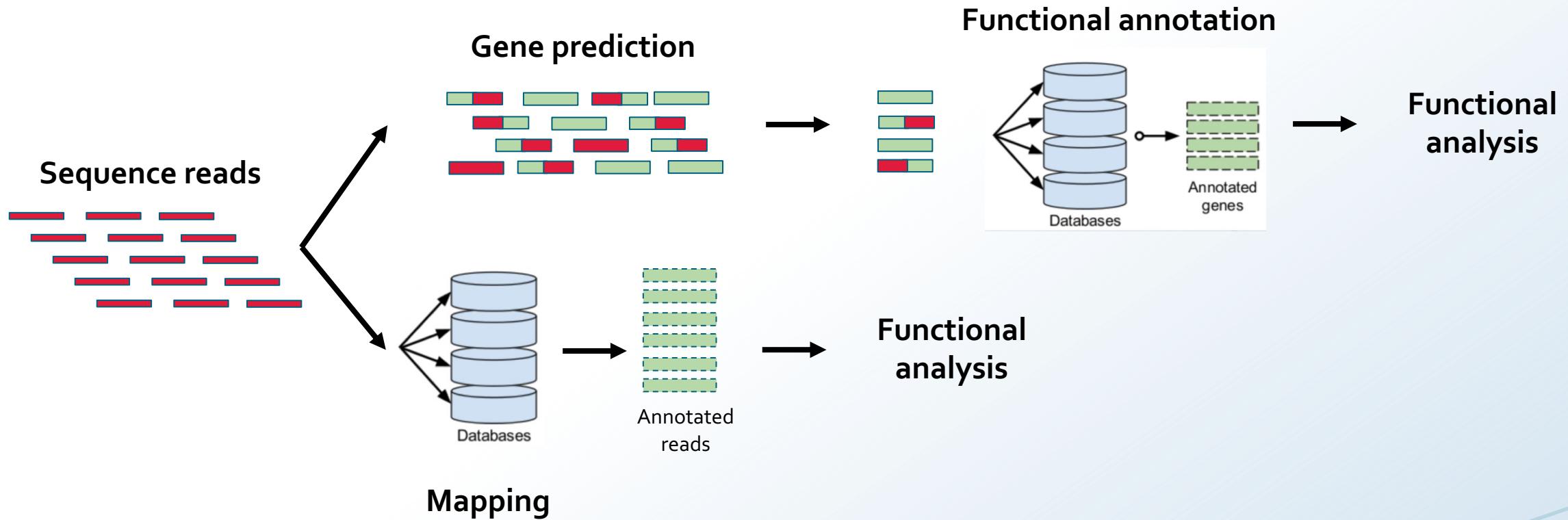
# Functional assignment of genes – Two approaches

Genes are predicted from either 1) raw reads or 2) assembled contigs and annotated using a tool and a database



# Functional assignment of reads – Two approaches

Functional assignment can be done either on predicted genes or by mapping reads against a database



## Assembly versus no assembly - Pros and cons

Functional annotation of full-length genes give more accurate assignments

Loose or complex to track abundance

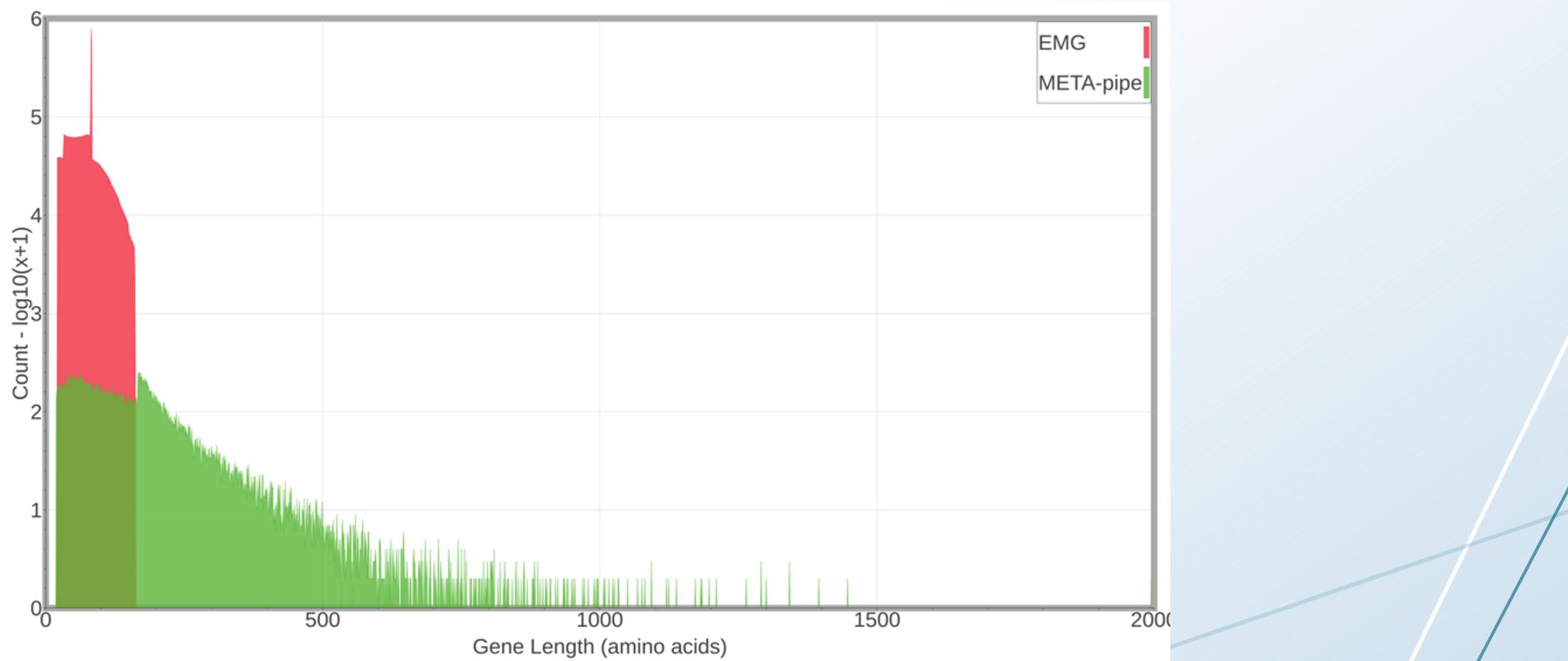
| Functional annotation assembled reads            | Functional annotation sequence reads            |
|--|---|
| Full-length genes give more accurate assignments | Gene fragments give more false positive matches |
| Assembly will remove abundance information       | Counting reads will keep abundance measures     |
|  |   |
|  |   |

# Functional comparison between EBI Metagenomics and Meta-pipe

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Assembly VS. no assembly

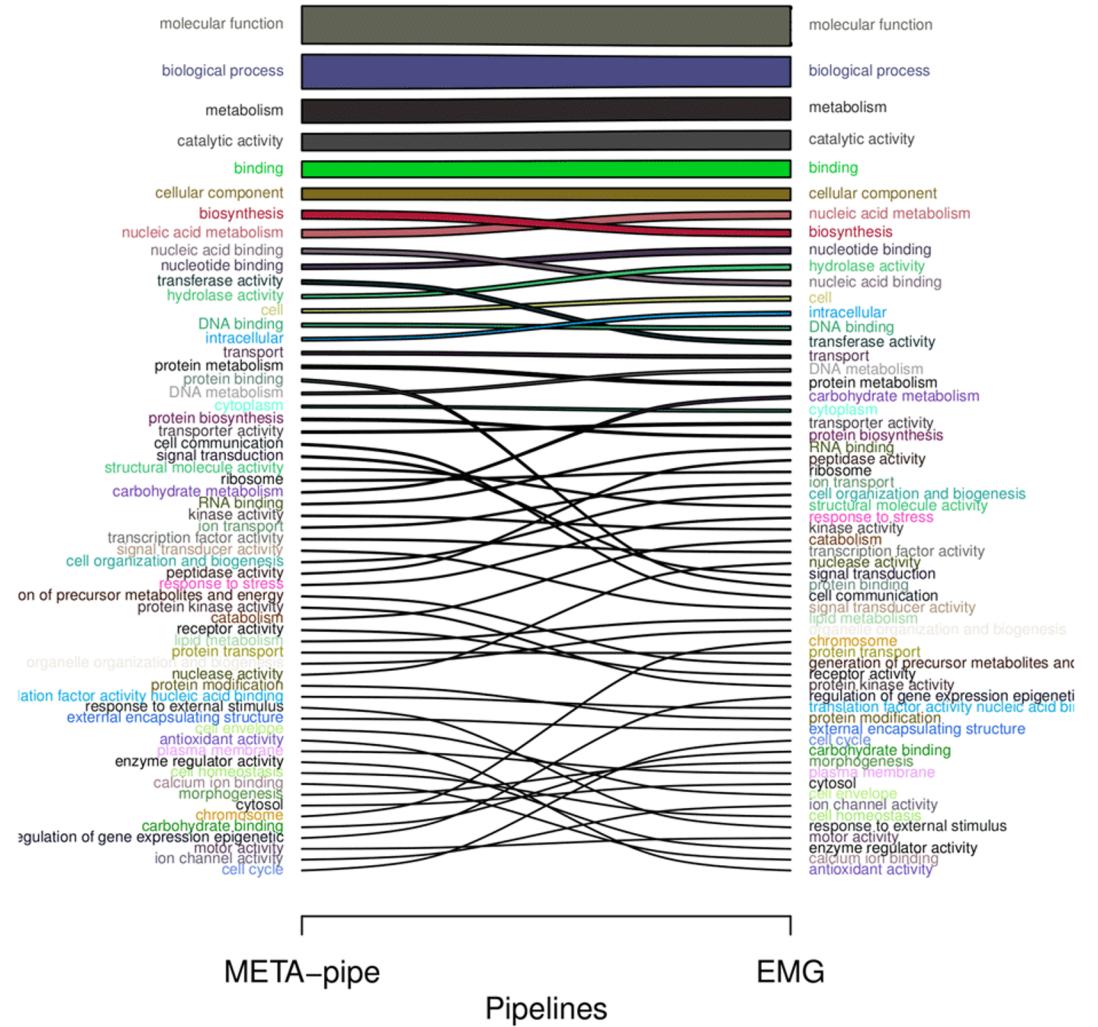
50.000 full length genes VS. 11.500.000 mostly fragmented genes



# Functional comparison between EBI Metagenomics and Meta-pipe

# Sorted counts of GO-terms to look at functional profiles

# Huge differences in niche Gene Ontologies



# Metagenomic gene prediction from metagenomic contigs or reads

Myriad of software available

Typically quick to run

Metagenomic contigs adds a layer of extra complexity (spurious contigs, codon usage, etc.)



# Functional assignment tools

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Used to query databases with predicted genes

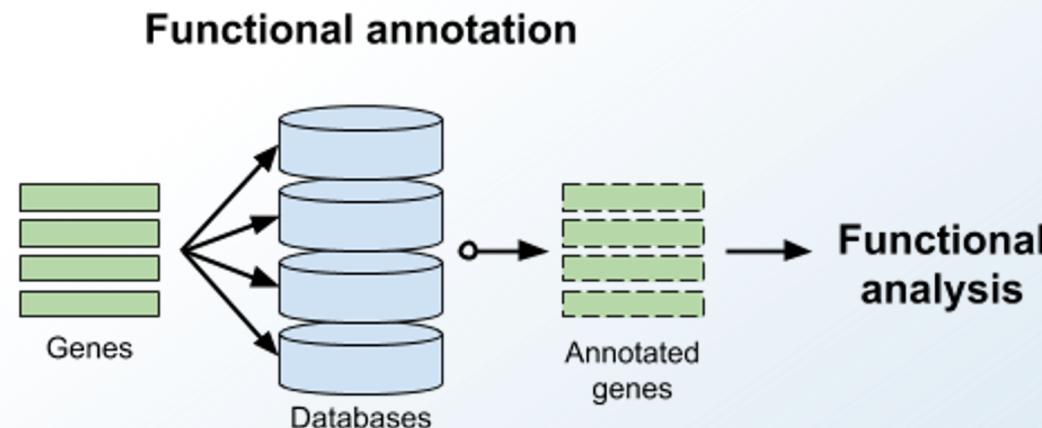
Most commonly tools used:

HMMer - Search sequence databases with Hidden Markov Models

BLAST - Basic Local Alignment Search Tool

Typical runtime for 30GB raw input (1 GB assembled):

1-2 days (functional annotation on 400 cores, supercomputer)



# Functional assignment databases

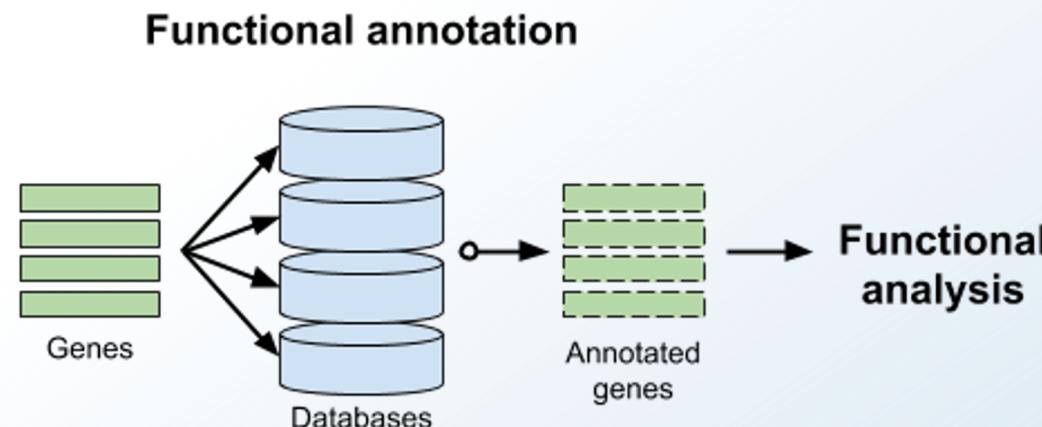
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Tons of databases available; some more generic, some specialized

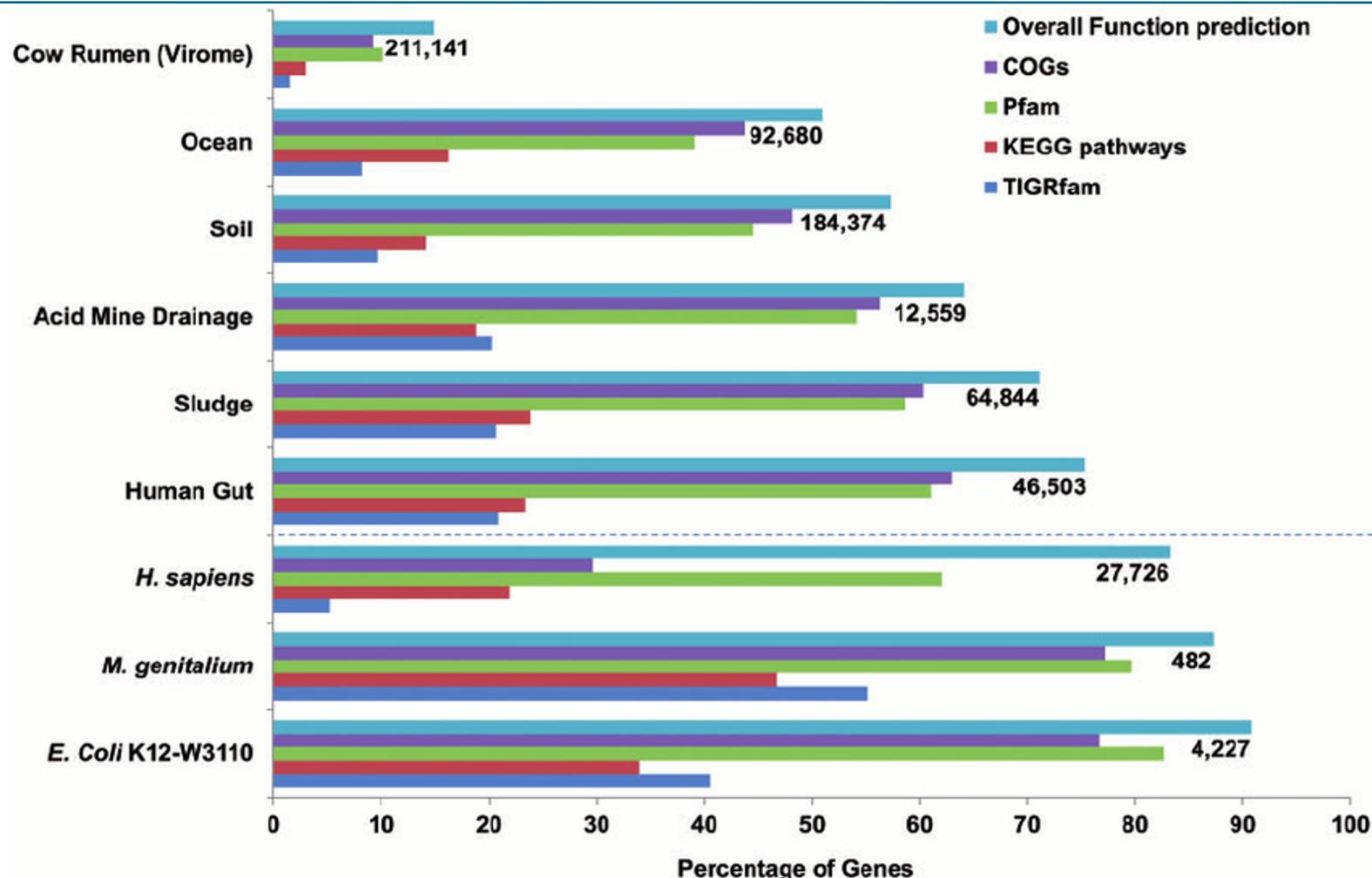
“Defines” the workload in metagenomic processing

Endless amounts of databases

Uniprot, NCBI, COG, KEGG



# Functional assignment databases



# Challenges in functional assignment

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Databases are lacking reference data to a varying degree

Requires extensive hardware resources

Backed by cluster computer

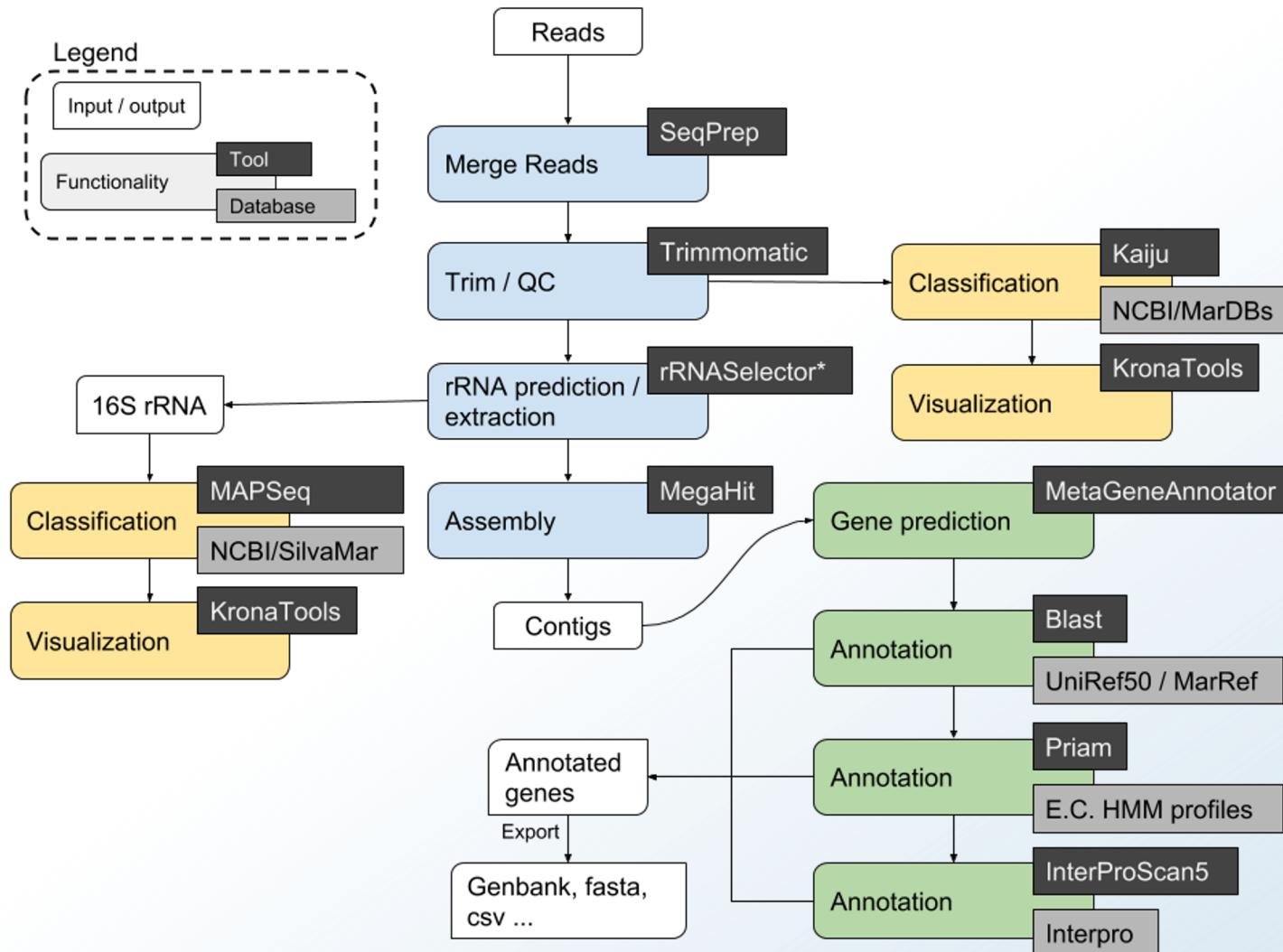
Typical runtime for 30GB raw input:

5-6 hours (preprocessing)

1-2 days (functional annotation)

Not feasible on a laptop!

# Functional analysis with Meta-pipe



Automated pipeline for the analysis and archiving of microbiome data

Users can submit their own data for analysis or freely browse all of the analysed public datasets held within the repository

Search by

Name, biome, or keyword

Text search

Sequence similarity

Sequence search

Or by data type

xxx

354465 amplicon  
27385 assemblies  
2050 metabarcoding  
33933 metagenomes  
2217 metatranscriptomes

 3733 studies  
325871 samples  
433630 analyses

Or by selected biomes



Human  
(141727)



Digestive system  
(94334)



Aquatic  
(45972)



Marine  
(33434)



Digestive system  
(32652)



Plants  
(26768)



Soil  
(23687)



Skin  
(10501)



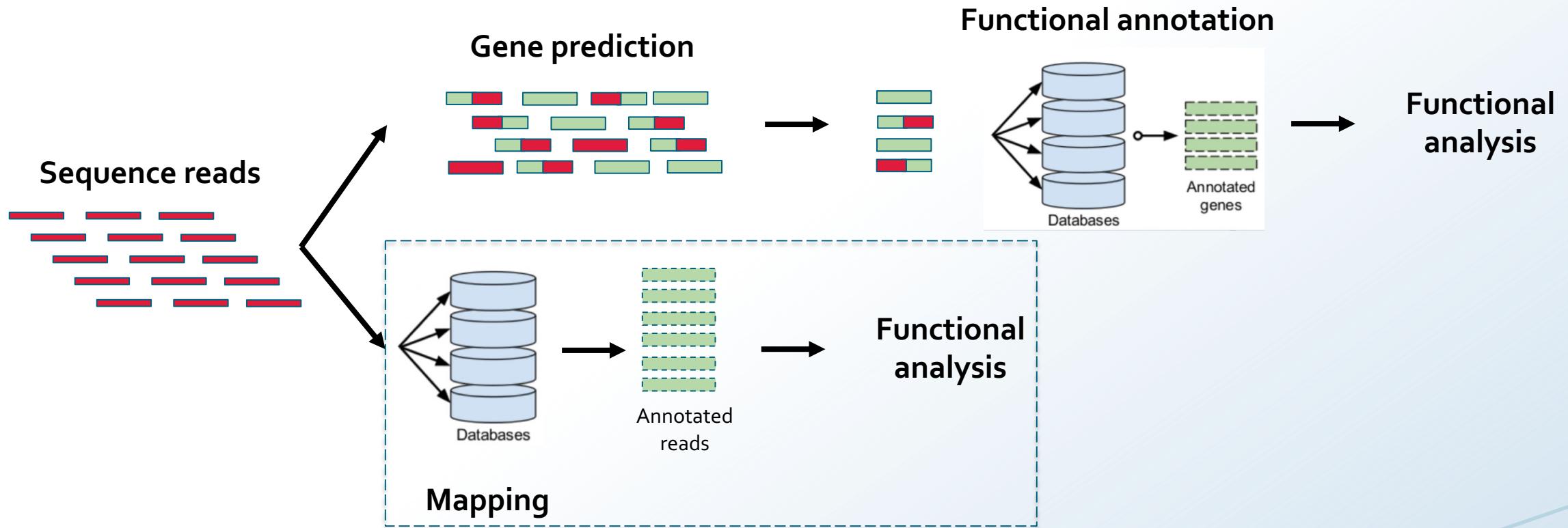
Wastewater  
(3861)



Food production  
(2805)

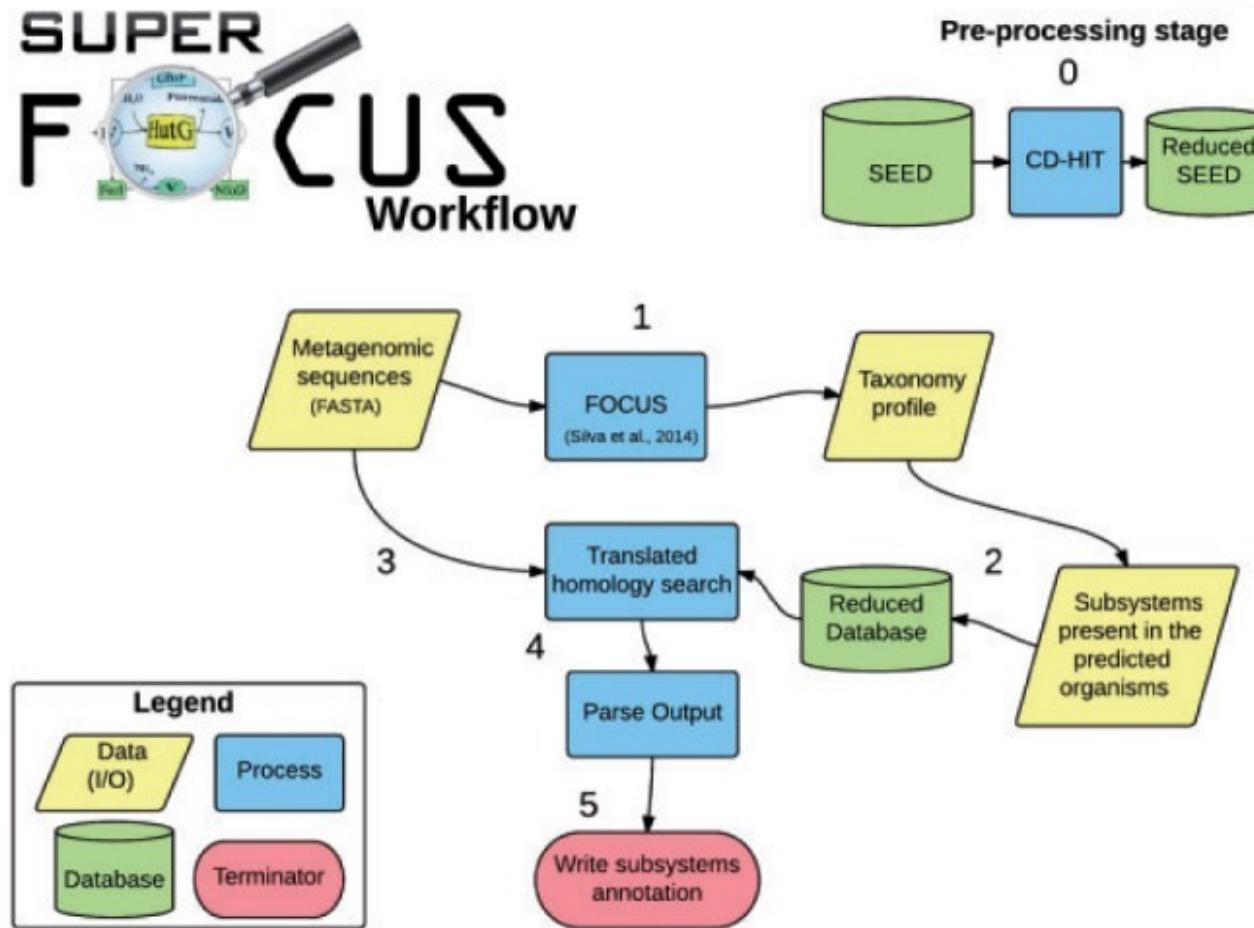
# Functional assignment on sequence reads

Mapping or gene prediction



# SUbsystems Profile by databasE Reduction using FOCUS

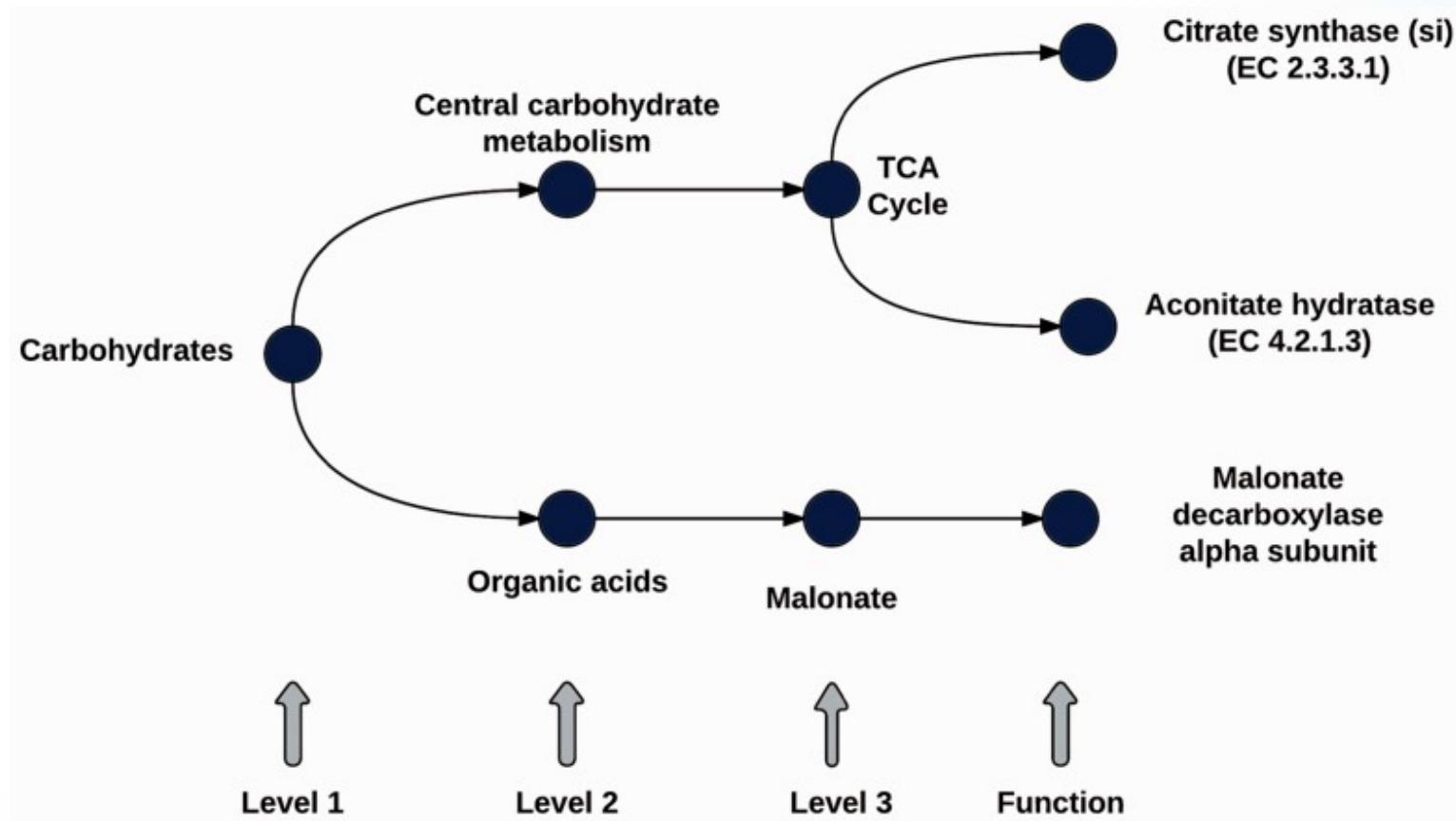
Classifies each sequence in the metagenome into a subsystem



# SEED database

SEED houses subsystems - collections of functionally related protein families

Composed of subsystems structured into three levels



# SUPER-FOCUS outputs tables for each subsystem

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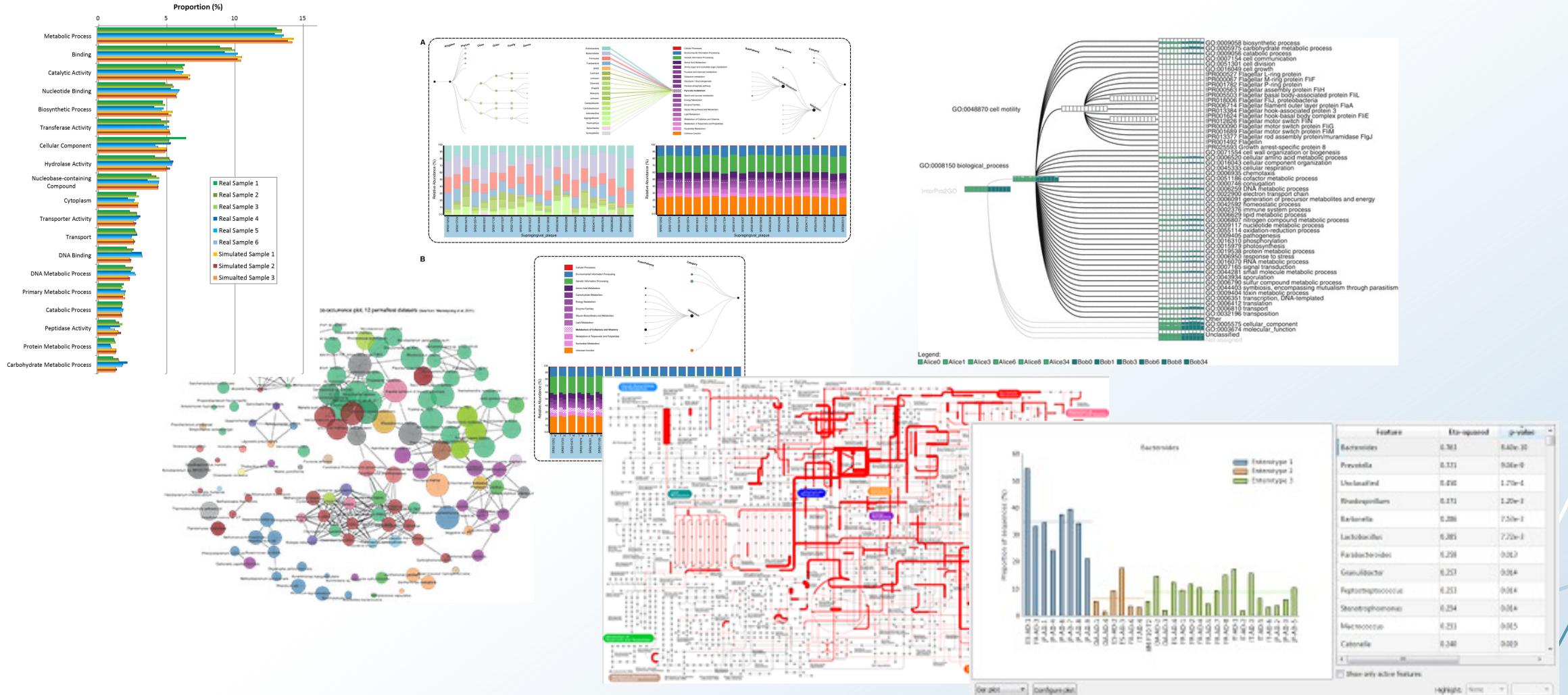
Two columns per sample:

Read counts - how many reads maps to each subsystem

Fractional abundance - how many percent of the total reads maps to each subsystem

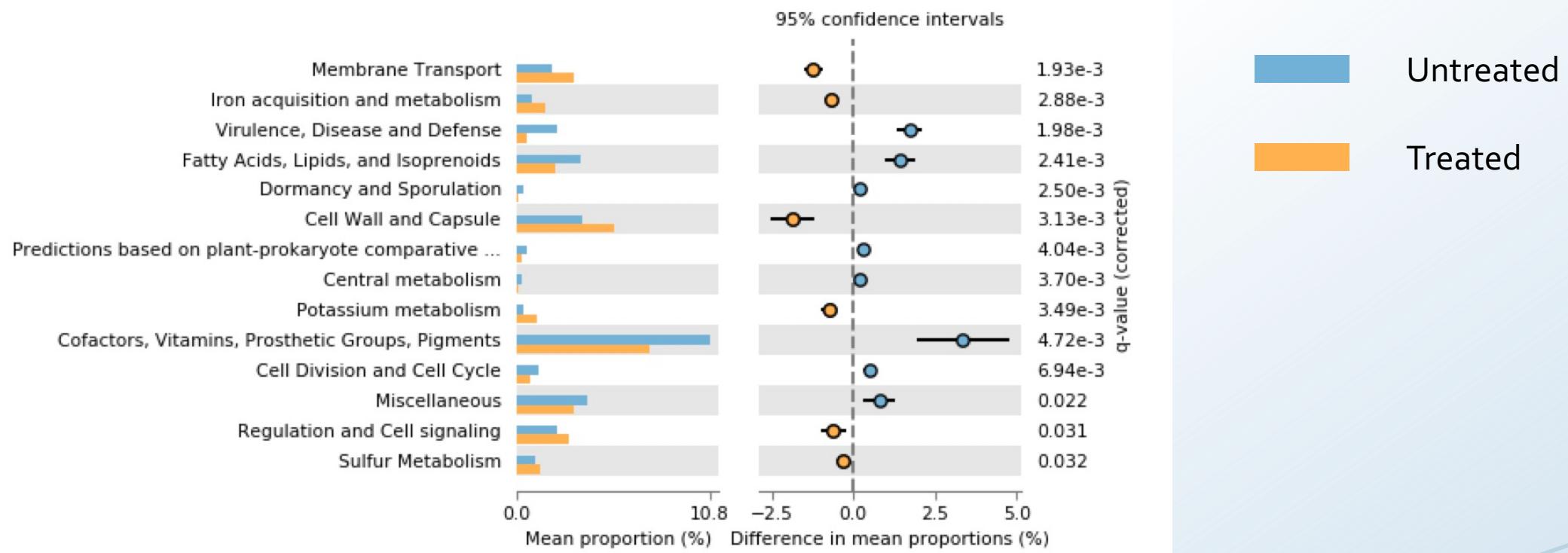
| Subsystem 1                  | Sample1 counts | Sample1 % | Sample2 counts | Sample2 % |
|------------------------------|----------------|-----------|----------------|-----------|
| Amino Acids and Derivatives  | 100000         | 10        | 500000         | 50        |
| Carbohydrates                | 200000         | 20        | 100000         | 10        |
| Cell Division and Cell Cycle | 300000         | 30        | 200000         | 20        |
| Cell Wall and Capsule        | 300000         | 30        | 100000         | 10        |
| Central metabolism           | 100000         | 10        | 100000         | 10        |
| ...                          | ...            | ...       | ...            | ...       |
| ...                          | ...            | ...       | ...            | ...       |

# Visualizing taxonomic or metabolic profiles - it is a jungle out there....



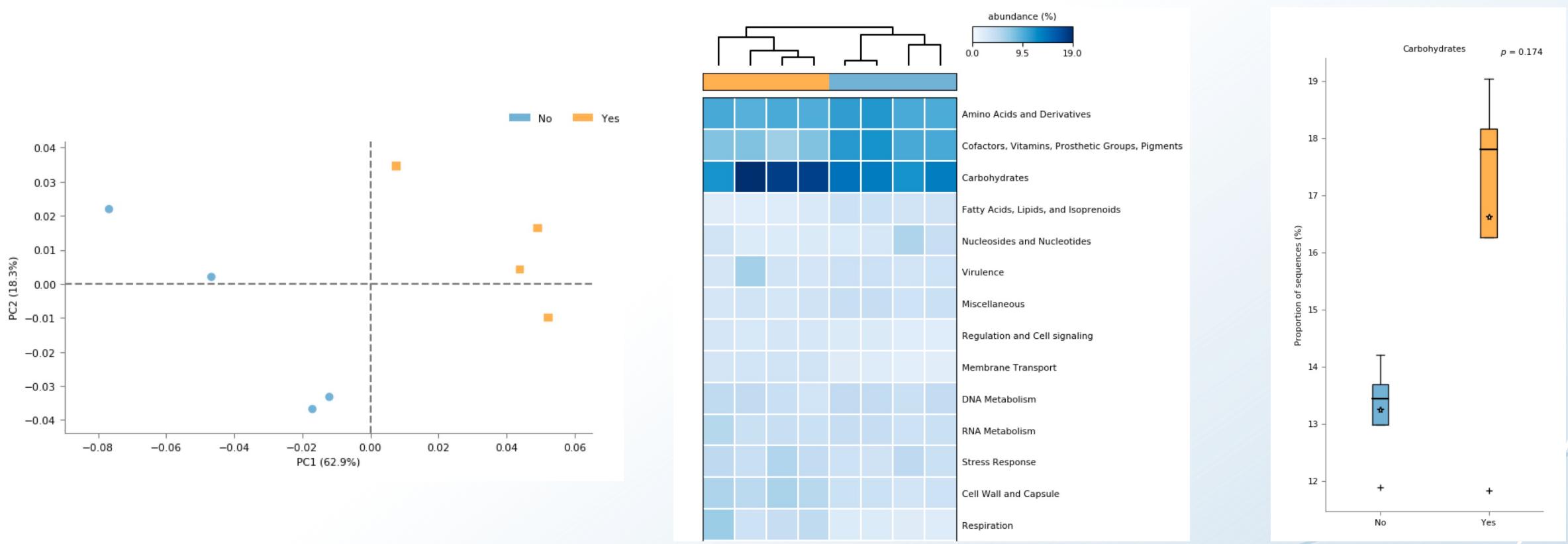
# STAMP: Statistical analysis of taxonomic and functional profiles

Software package for analysing taxonomic or metabolic profiles



# STAMP: Statistical analysis of taxonomic and functional profiles

Statistical hypothesis tests for pairs of samples or groups of samples is support along with a wide range of exploratory plots

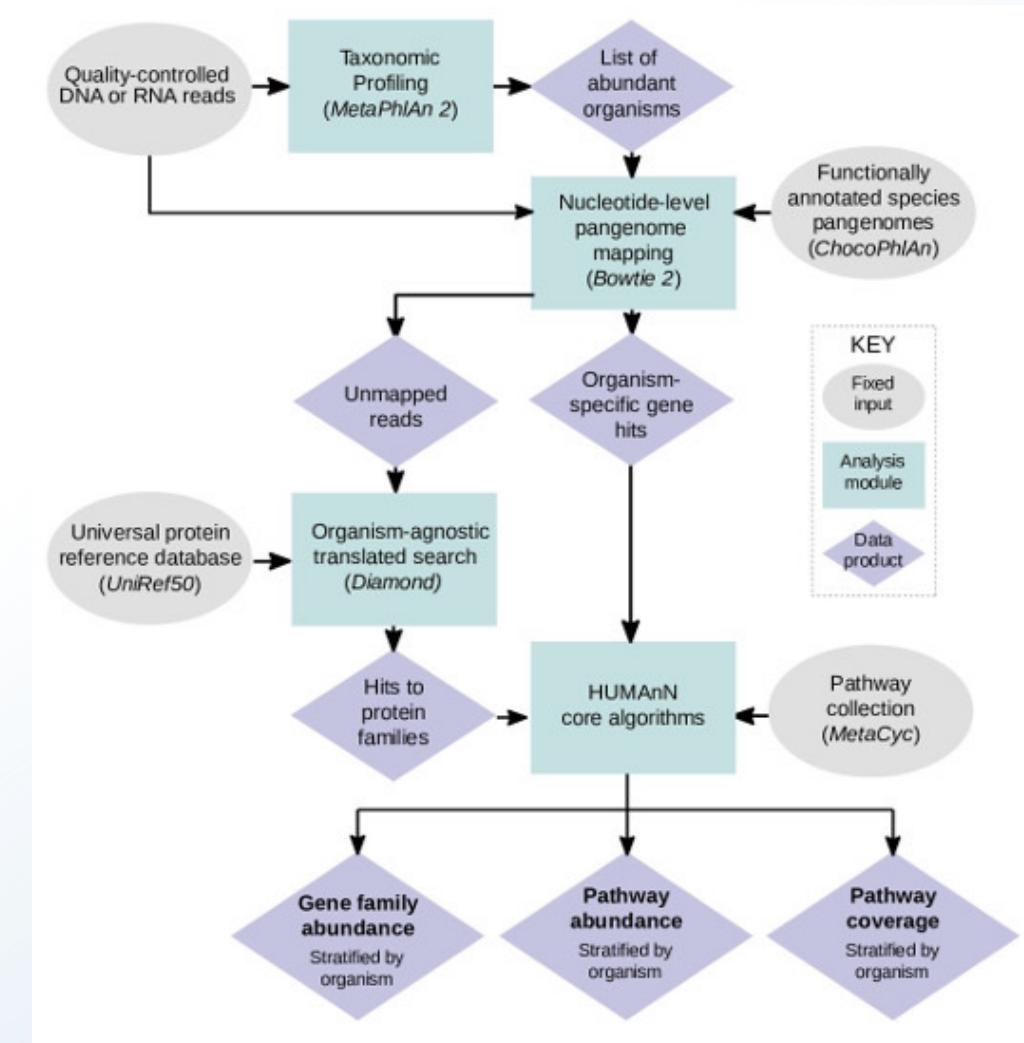


# HUMAnN2 - The HMP Unified Metabolic Analysis Network 2

Analysis pipeline for abundance of microbial pathways

Allows comparisons of multiple samples

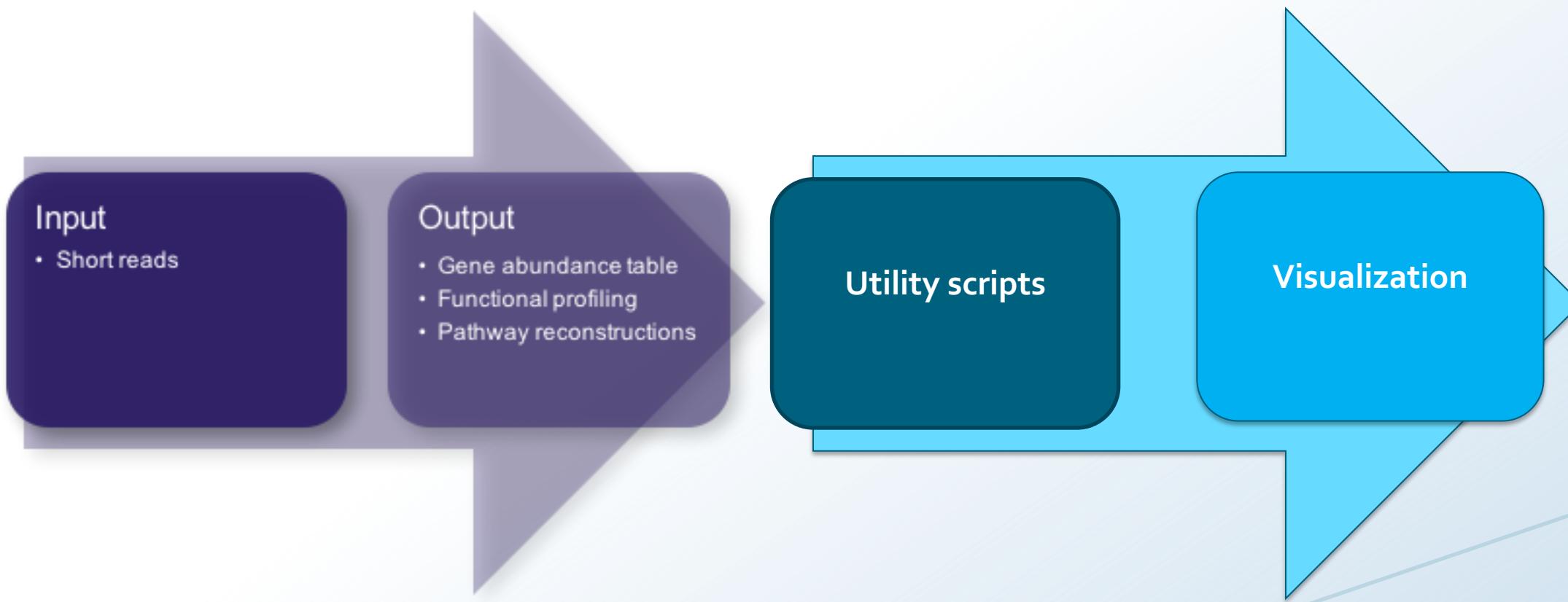
Combine taxonomic information with functional information



# HUMAnN2 - The HMP Unified Metabolic Analysis Network 2

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Utility scripts for downstream analysis and visualization



# HUMAnN2 visualization

Bar plot that combine functional information with taxonomic contribution

