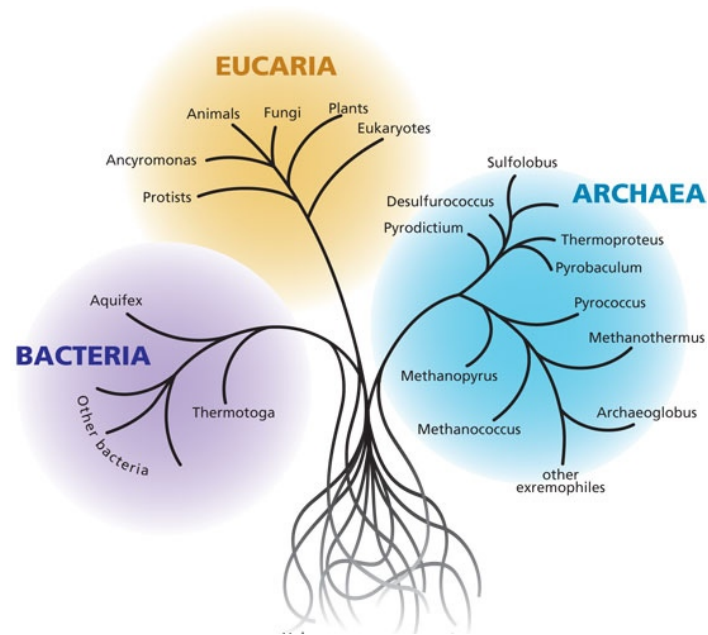


Johannes Dröge, [johannes.droege@chalmers.se](mailto:johannes.droege@chalmers.se)  
EMBO practical course **Plant Microbiota**  
Cologne, March/April 2017

# Taxonomic Characterization and Diversity Analyses

# Taxonomy Structure

- Hierarchical ordering (topology)
- Introduced for higher-level organisms
  - Carl von Linné
  - classification by morphological traits
- Microbial taxonomy
  - mostly by nucleotide sequence
  - approximates **species tree of life**

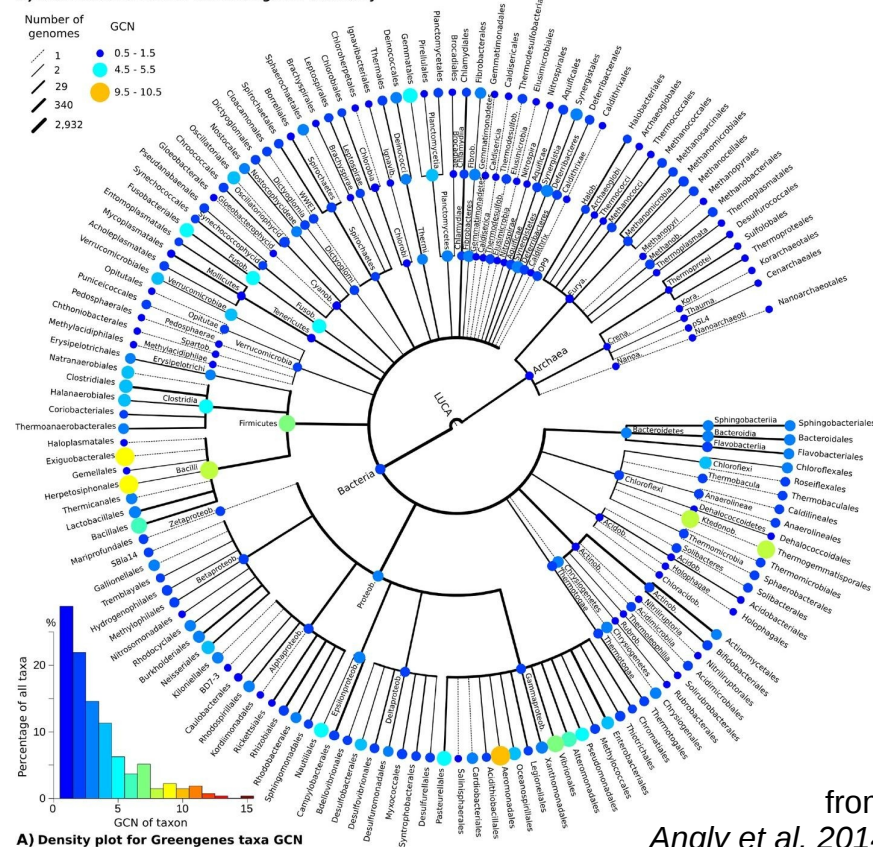


from Woods Hole Currents, Vol. 8

# Using Taxonomy

- Simplify reasoning
  - group OTUs by evolution
  - transfer knowledge
- Create features for analysis
  - compare communities

B) Distribution of GCN in the Greengenes taxonomy

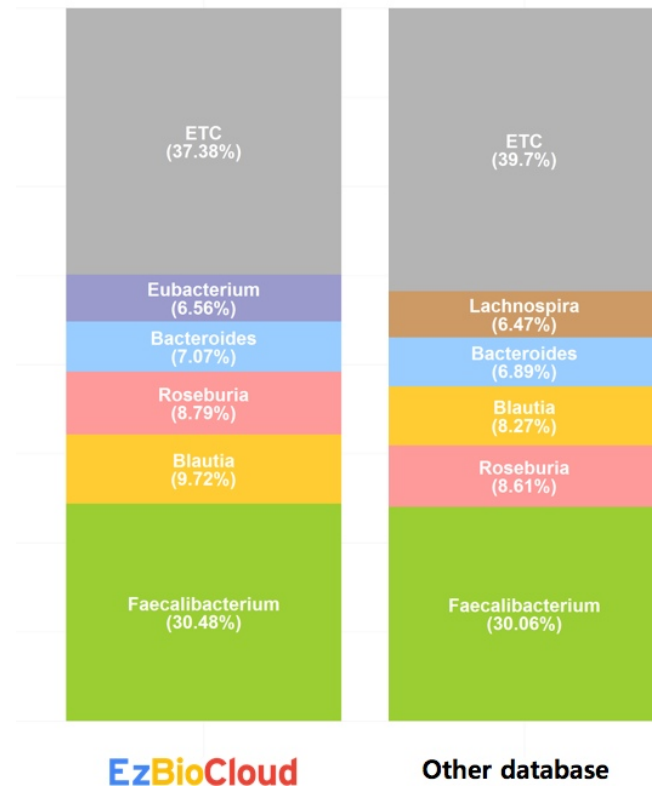


from  
Angly et al. 2014

# Microbial Taxonomy Providers

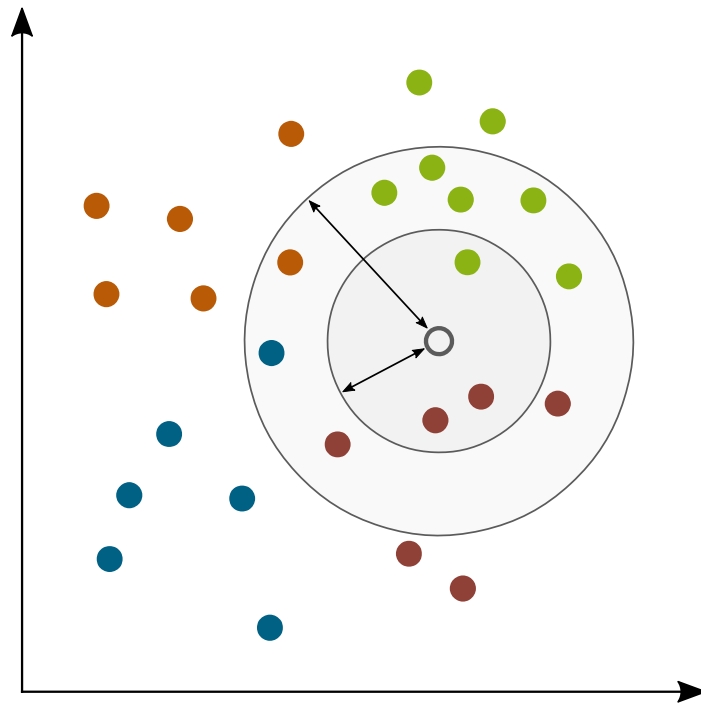
- GreenGenes (08/2013)
- Ribosomal Database Project (09/2016)
- SILVA rRNA database project (09/2016)
- EzBioCloud (03/2017)
- NCBI taxonomy (continuous updates)
- **check usage restrictions!**

from [www.ezbiocloud.net](http://www.ezbiocloud.net)



# Taxonomic Classifications

- Basic ingredients
  - reference sequences
  - corresponding taxonomy
  - similarity search program
- Do **nearest neighbor classification**
  - find close references
  - carry over taxonomic annotation



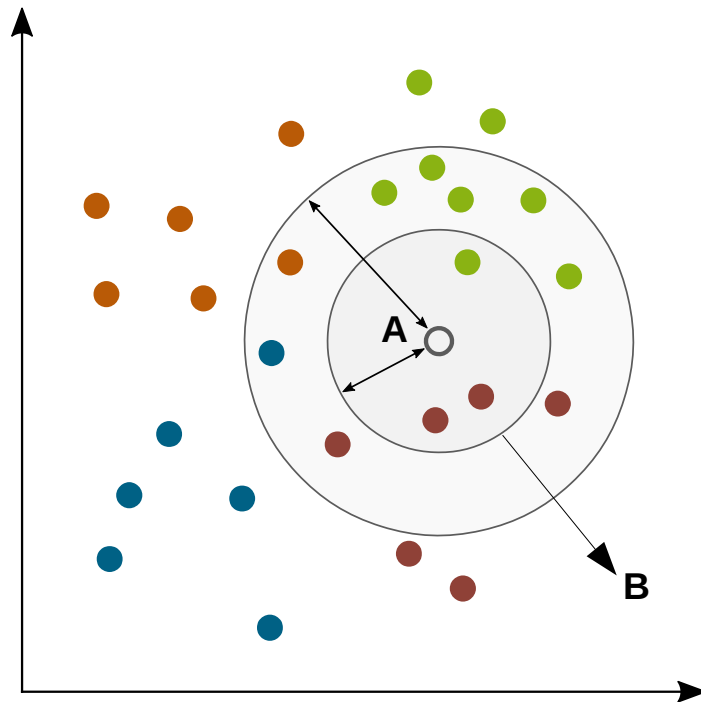
# Methods for Classification

## A) Similarity search

- local alignment (BLAST)
- fast k-mer comparison

## B) Taxonomy assignment

- majority vote
- **lowest common ancestor (LCA)**
- phylogenetic inference



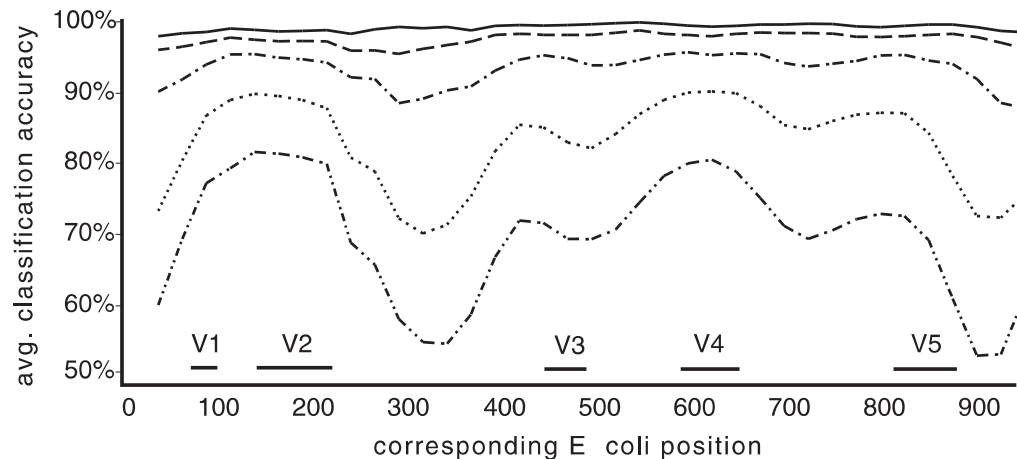
# Programs

- all-inclusive:
  - **QIIME**: wrappers
  - **mothur**: re-implementations
  - download reference sequences+taxonomy and search+classify
- stand-alone: RDP classifier
- online: RDP, SILVA/SINA



# RDP Classifier

- Naïve Bayesian classifier
- Original: all predictions at genus level
- *mothur* re-implementation: dynamic rank classifications
- Naïve Bayesian classifier
- Frequencies of shared 7-mers
- Bootstrapping confidence scores

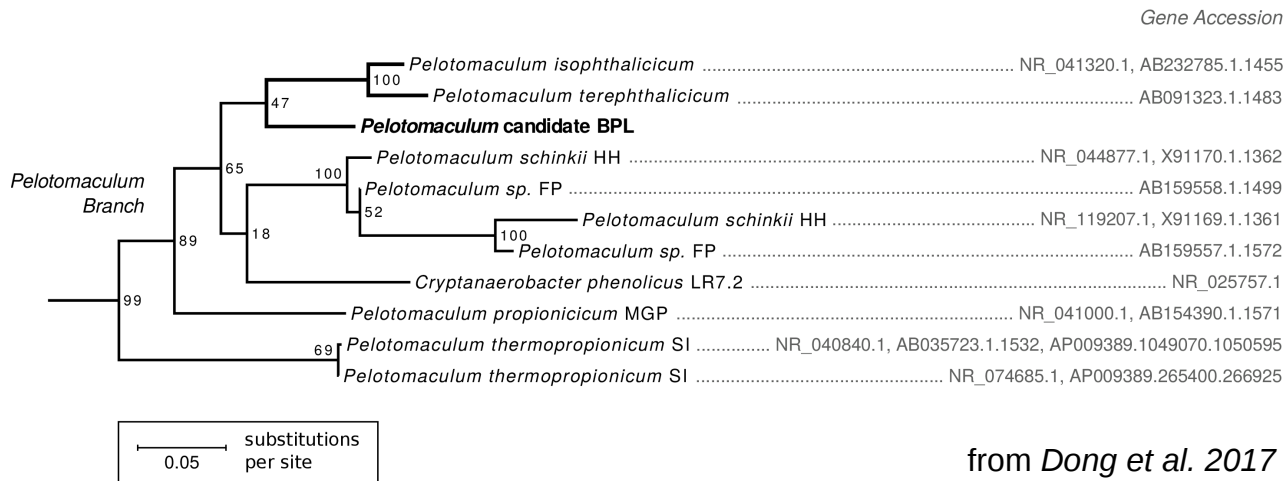


from Wang et al. 2007



# Phylogenetic Reconstruction

- Learn about evolution of novel, deep-branching OTUs
- Collect homologs
- Create **Multiple Sequence Alignment**
- Construct **phylogenetic tree**



# Shotgun Metagenomes

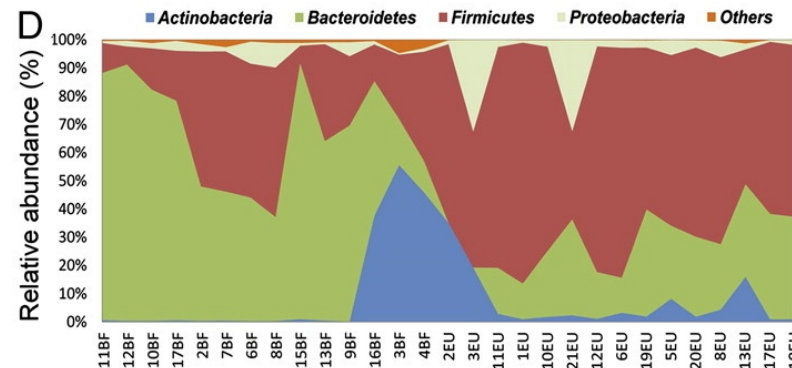
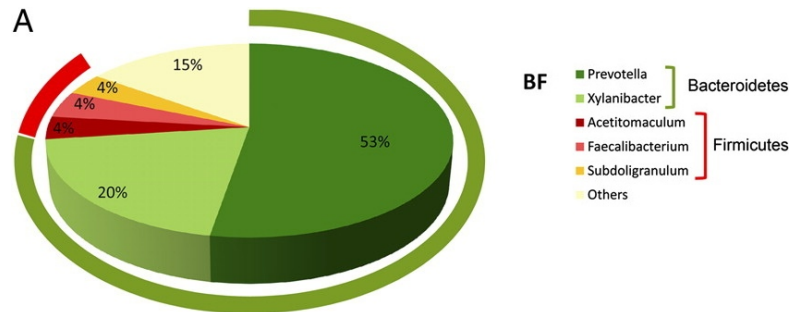
- Characterize community by extracting genes for classification
  - ribosomal: 5S/16S/18S
  - single-copy marker genes  
e.g. Campbell et al. 2016
- Local alignment (*BLAST*)
- Hidden Markov models (HMMs)

# Whole-genome Classification

- genome bins/partial genomes
  - nucleotide composition (k-mers): *NBC*, *PhyloPythiaS(+)*
  - sequence similarity: *Centrifuge*, *taxator-tk*
- full genomes
  - average nucleotide identity (ANI)
  - *MUMMER*

# Abundance and Taxonomy

- combine number of reads and taxa
- compare profiles over communities, conditions etc.
- ordination techniques to visualize similarity
- diversity estimation



from *Filippo et al. 2010*

# Keep in mind

- Absolute profiles are skewed by (16S) gene copy number variations
- Primer bias (amplicions)
- Species (16S) vs. gene evolution
- Specifics of assignment algorithm
  - selected taxonomy
  - level of false positives
- **Don't put too much trust into taxa**
- **Calculate fold change**

# Hands-on Session

Taxonomic classification

# Load Tutorial Enviroment

- includes QIIME scripts and shell functions

```
source base_folder/activate.sh
```

# QIIME assign\_taxonomy.py

- See online documentation at [http://qiime.org/scripts/assign\\_taxonomy.html](http://qiime.org/scripts/assign_taxonomy.html)
- use different taxonomy and reference sequences
  - GreenGenes, SILVA, RDP (folder references)
- use different methods
  - uclust, mothur/rdp, sortmerna



# Inspect Taxonomic Annotation

- compare output with

```
show_tax_assignments output1.txt output2.txt | less -S
```

- run mothur/rdp twice and compare results between runs
- compare with whole genome annotations
  - in references/wgs.txt
  - uses NCBI taxonomy
  - generated with *taxator-tk*

# Compare to Online Annotation Services

- Extract first 10 sequences using

```
seqkit head 10 < in.fna > out.fna
```

- SILVA/SINA aligner  
<https://www.arb-silva.de/aligner/>
- RDP Seqmatch  
[https://rdp.cme.msu.edu/seqmatch/seqmatch\\_intro.jsp](https://rdp.cme.msu.edu/seqmatch/seqmatch_intro.jsp)

# Annotate Your OTU-picked Data (morning session)

- See online documentation for
  - `pick_otus.py`
  - `assign_taxonomy.py`
  - `make_otu_table.py`
  - `summarize_taxa.py`