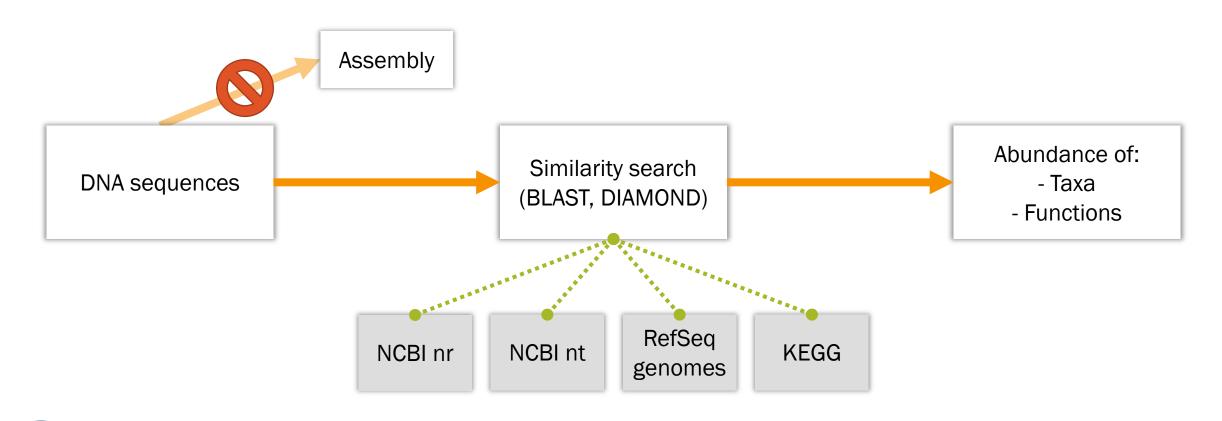
# **Environmental** metagenomics

Read-based analyses



## What is read-based profiling?



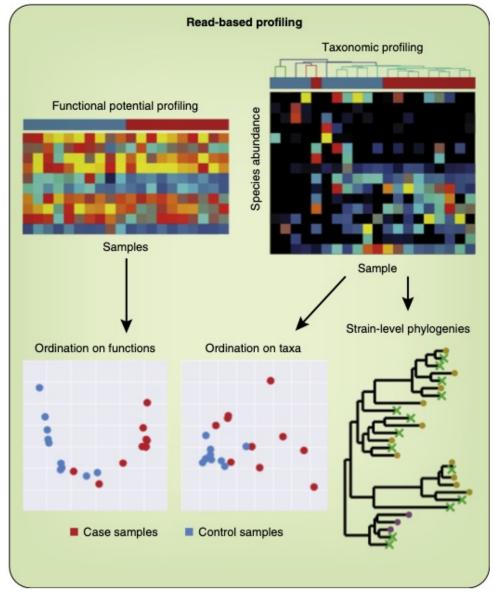
### Read-based profiling is

**Fast** 

Quantitative

Somewhat outdated

- Assembly-based are preferred
- Can give interesting preliminary insights
- Usually done as a "quick-and-dirty" estimate prior to assembly

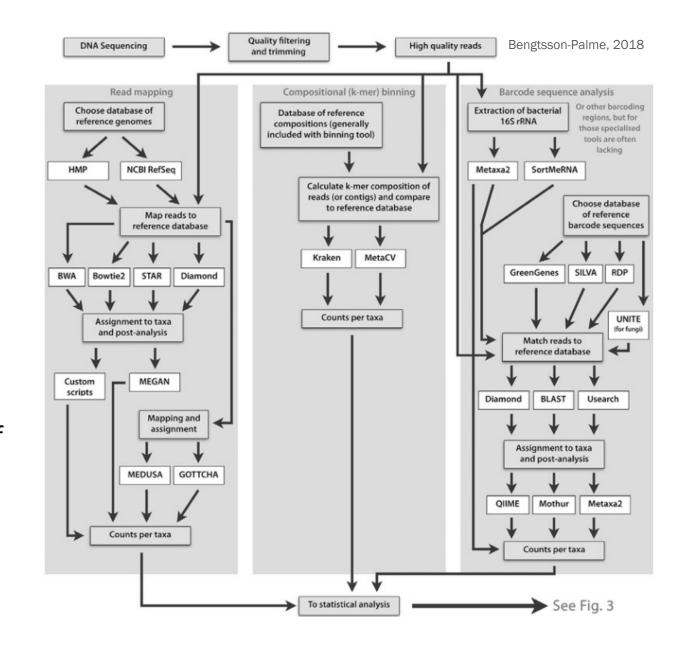




## Approaches to taxonomic profiling

## Read mapping and compositional binning

- Analysis of all reads
- Reference database of sequenced genomes
- Mapping: slow, requires lots of CPU and RAM
- Compositional binning: faster but less accurate

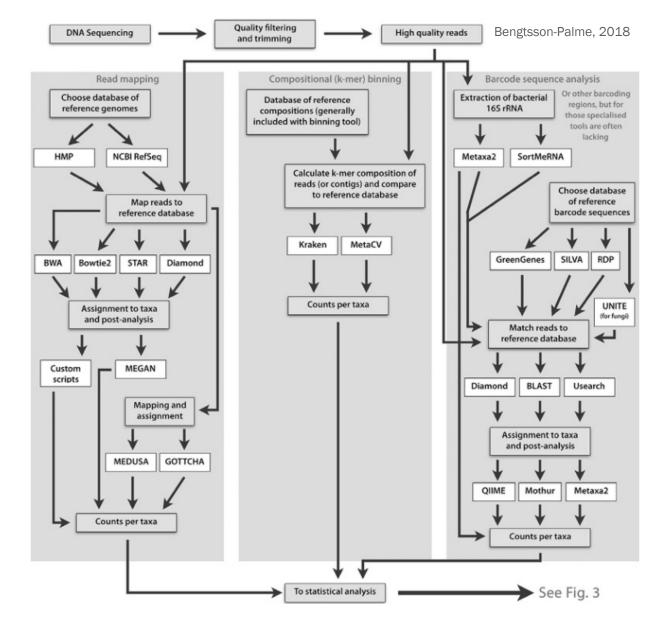




## Approaches to taxonomic profiling

#### Barcode sequence analysis

- Analysis of specific barcode genes (e.g. 16S rRNA)
- Curated database of barcode sequences (e.g. SILVA)
- Much faster than the other approaches, but provides lower resolution





## Approaches to taxonomic profiling: how to choose?

Analysis of all reads suffer from limited databases of reference genomes

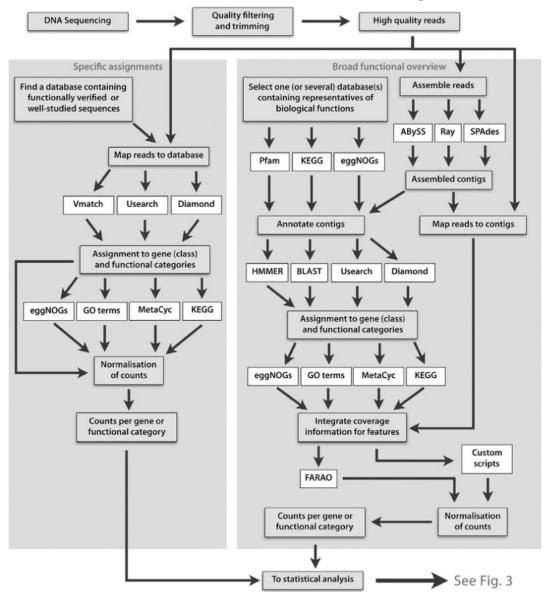
 More suitable for environments that are better described (e.g. human gut) Analysis of barcode genes suffer from lower resolution

 More suitable for environments with a high fraction of unknown microorganisms (e.g. soil)

## Approaches to <u>functional</u> profiling

#### Broad versus specific profiling

- Broad DBs: entire functional universe (e.g. KEGG, PFAM)
- Specific DBs: focusing on one or few processes (e.g. CAZy, CARD)



## Approaches to functional profiling: how to choose?

Broad databases give an overview of the functional potential of microbial communities

 Suitable for investigating major differences across environments Specific databases are often highly curated and can give substrate-level information

 Suitable for investigating e.g. gene variants across environments

### Making sense of readbased analyses

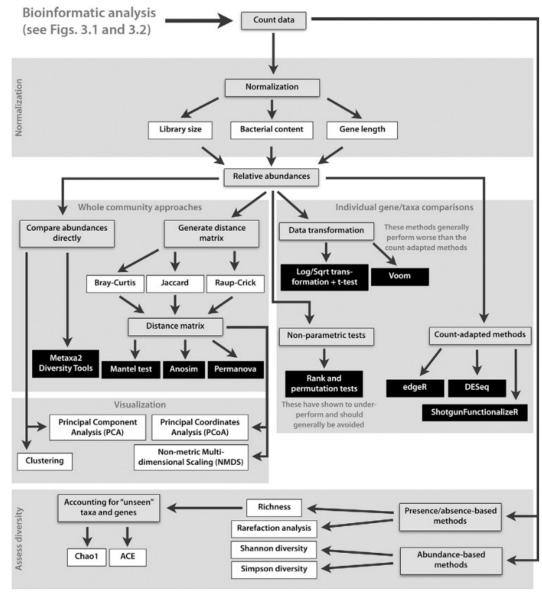
#### Comparative analyses

#### **Statistics**

- Univariate (e.g. ANOVA of specific genes and taxa)
- Multivariate (e.g. PERMANOVA, ordination/clustering, Mantel test)

#### Normalization!

- Library size
- Bacterial content (e.g rpoB gene)



### Pitfalls of read-based analyses

#### Curation level of the database

Are sequences verified experimentally to perform the expected function?

#### Comprehensiveness of the database

Both taxonomic- and functionally

#### Speed versus sensitivity tradeoff

• E.g. BLAST versus DIAMOND

#### Choice of identity, bitscore/e-value and coverage cutoffs

 No way to generalise for all genes, things have to be checked more or less manually, e.g. by looking at the literature for the gene



### Remember: always sanity check!

#### Especially for unexpected findings:

- Redo with more strict thresholds
- Redo with a different tool (e.g. BLAST versus DIAMOND) and database
- Investigate other genes belonging to the same pathway

### References and further reading

Quince C. et al. 2017. Shotgun metagenomics, from sampling to analysis. Link

Bengtsson-Palme J. 2018. Strategies for taxonomic and functional annotation of metagenomes. <u>Link</u>

Paliy O. & Shankar V. 2016. Application of multivariate statistical techniques in microbial ecology. Link

Jonsson V. et al. 2016. Statistical evaluation of methods for identification of differentially abundant genes in comparative metagenomics. Link

