



# Hands on introduction to ancient microbiome analysis

Maxime Borry - August 18<sup>th</sup> 2021

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Doorway  
to Human History



# Teaching material

[tinyurl.com/ancientmicrobiome](https://tinyurl.com/ancientmicrobiome)



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# Who am I ?



**Maxime Borry** - Doctoral researcher at [MPI-SHH](#) - [MPI-EVA](#)

Ancient DNA microbiome bioinformatics



[@notmaxib](#)



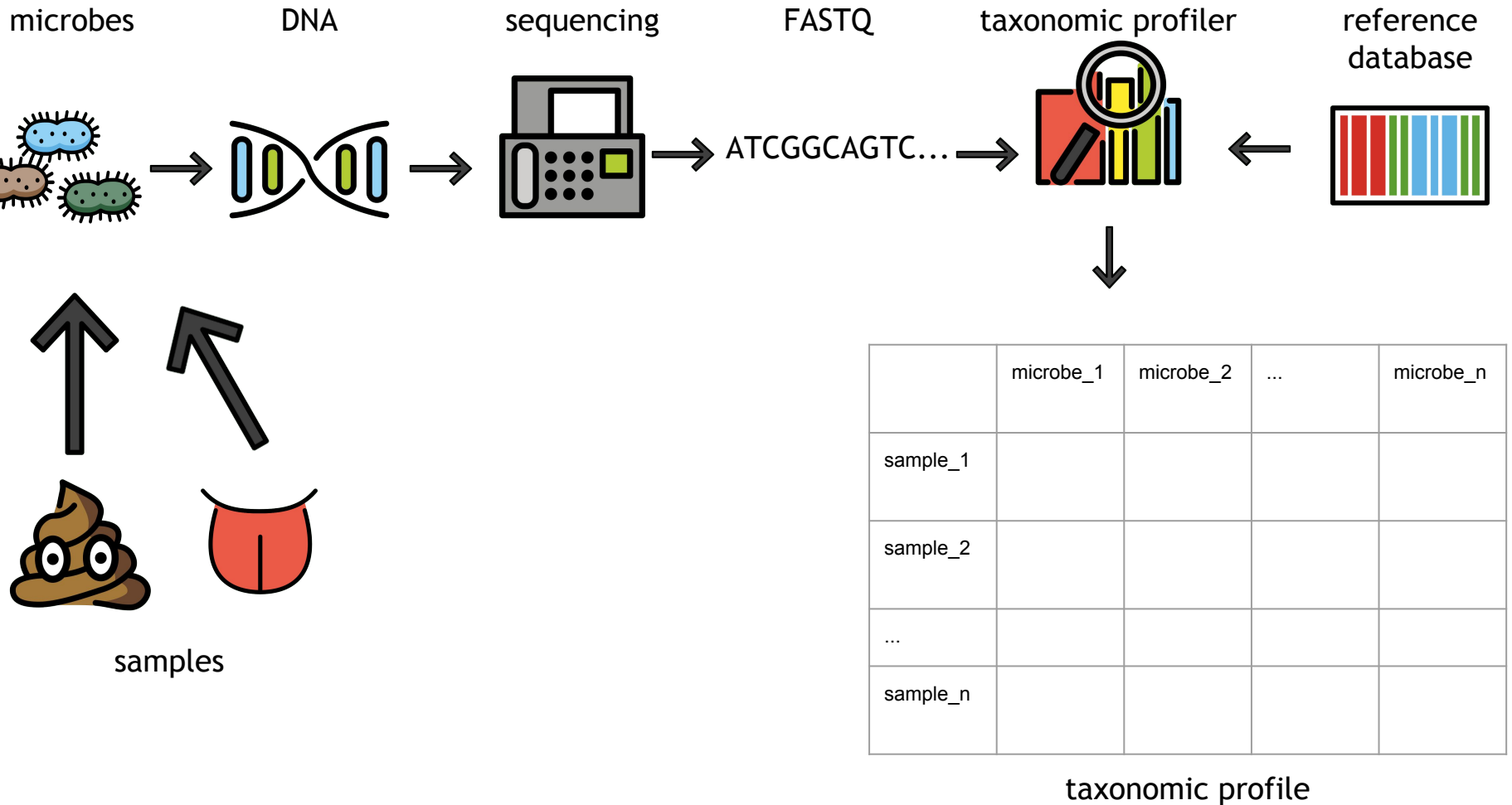
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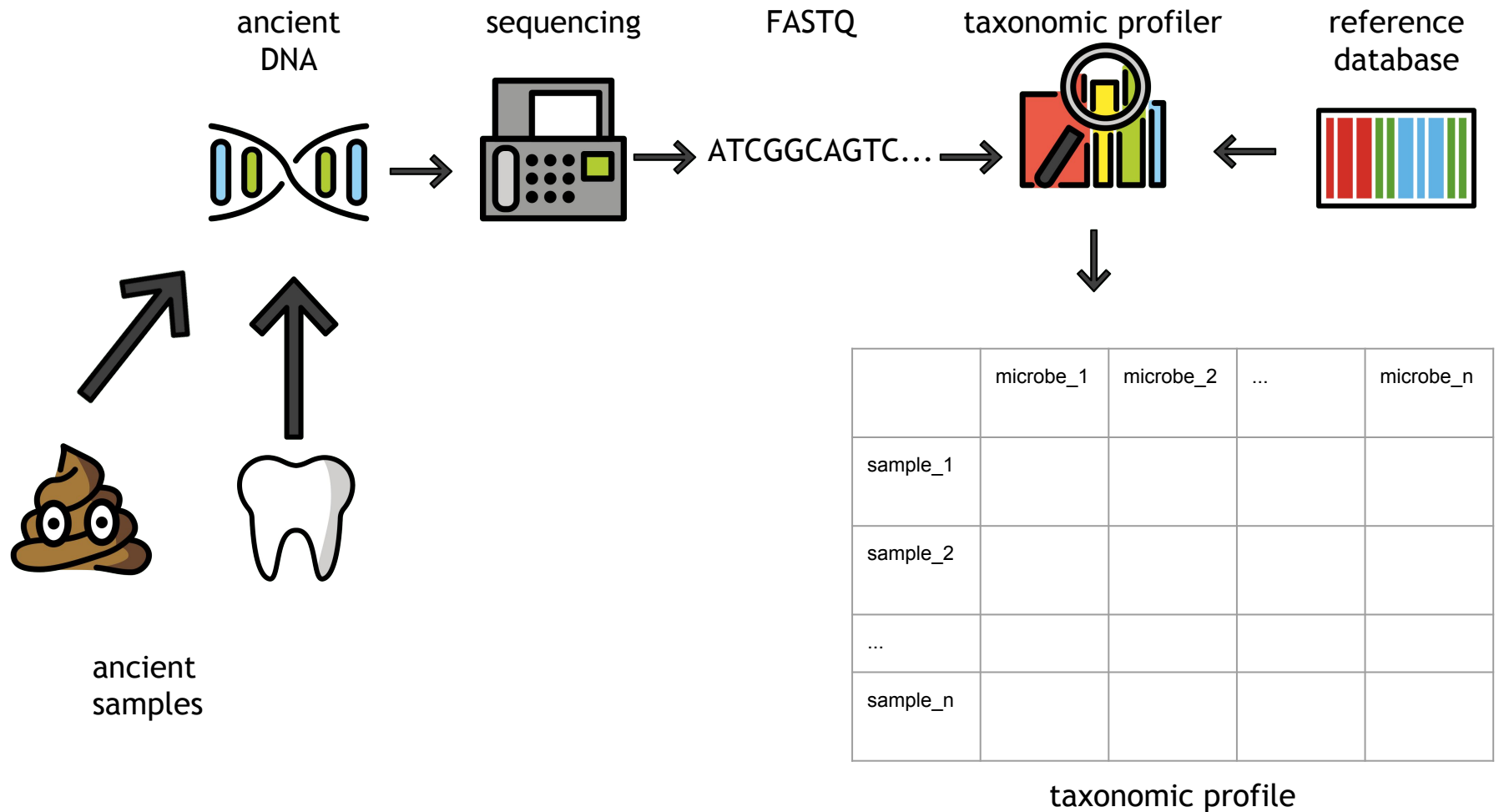
[maximeborry.com](#)



# How do we analyze microbiomes ?



# How do we analyze ancient microbiomes ?





# How do we analyze ancient microbiomes ?



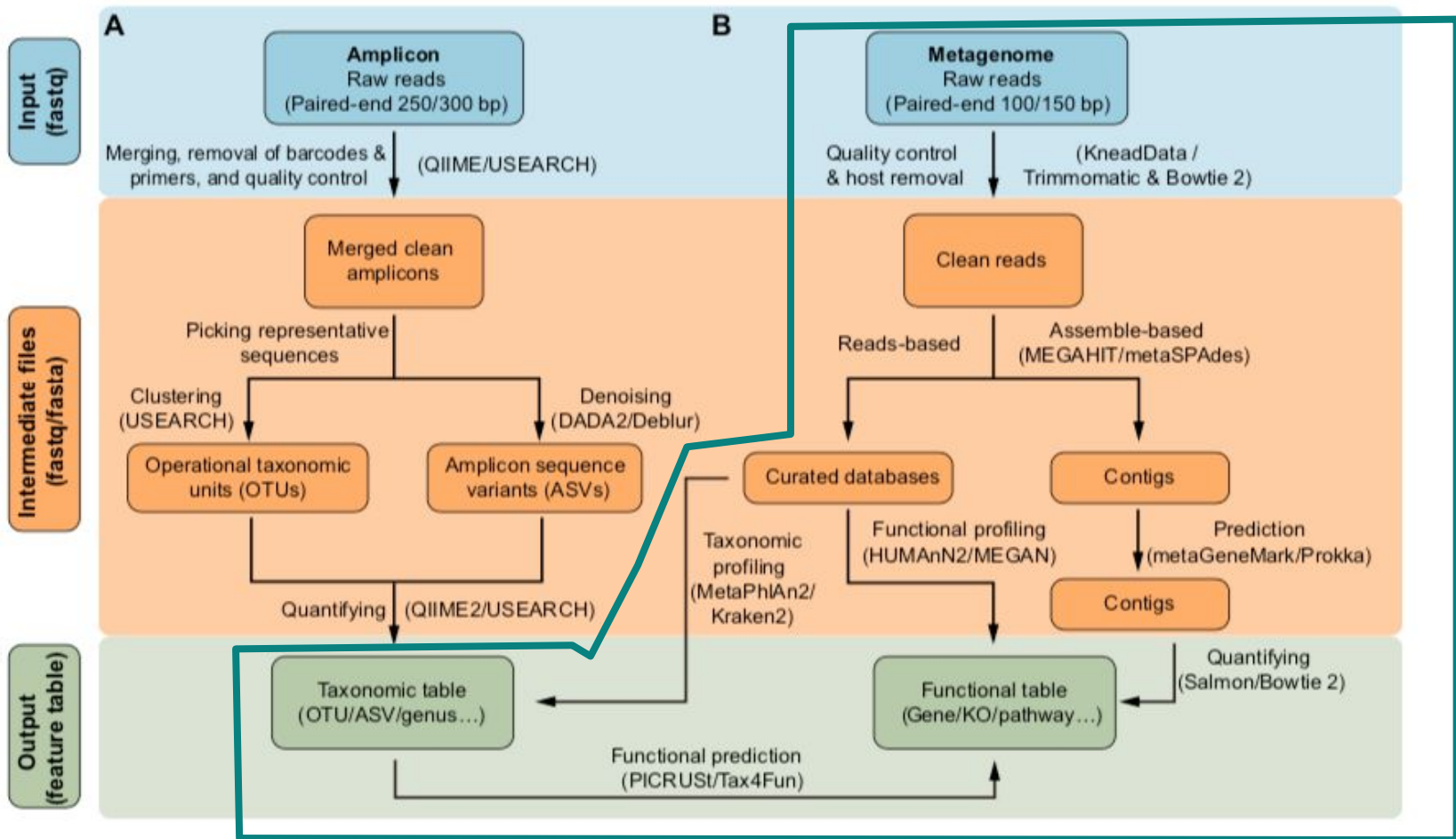
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# More in details



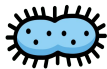
Liu Y-X, Qin Y, Chen T, Lu M, Qian X, Guo X, Bai Y. 2021. A practical guide to amplicon and metagenomic analysis of microbiome data. *Protein & Cell* 12:315–330. DOI: [10.1007/s13238-020-00724-8](https://doi.org/10.1007/s13238-020-00724-8).



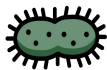
# Ambiguity in taxonomic assignment

sequence 1 ATGGTCGGGCAGGACGTTGCGAGT

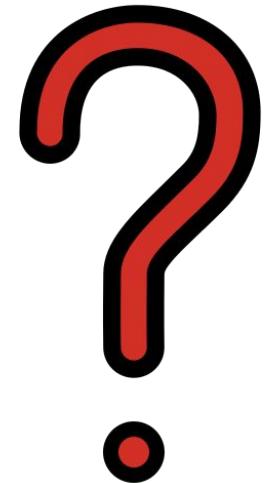
sequence 2 CGAGAAGGGCAGGACGCCACGTAC



ATGGTCGGGCAGGACGTTGCGAGT

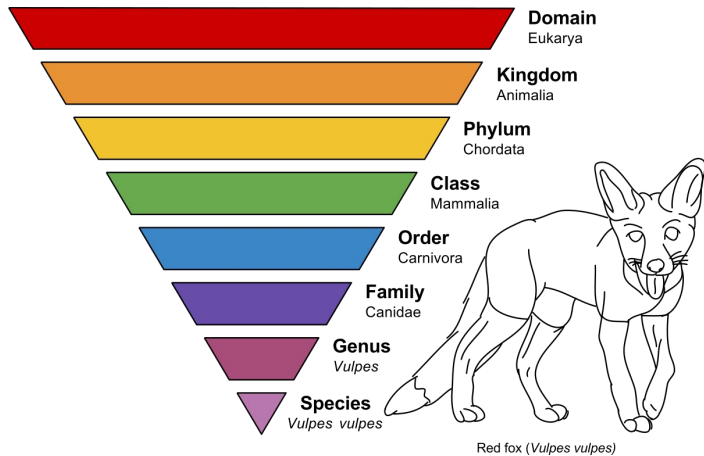


CGAGAAGGGCAGGACGCCACGTAC

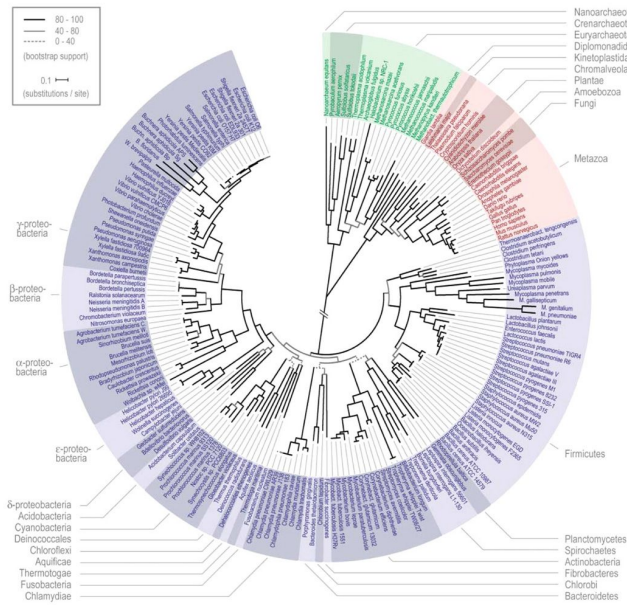




# Taxonomy and LCA to the rescue

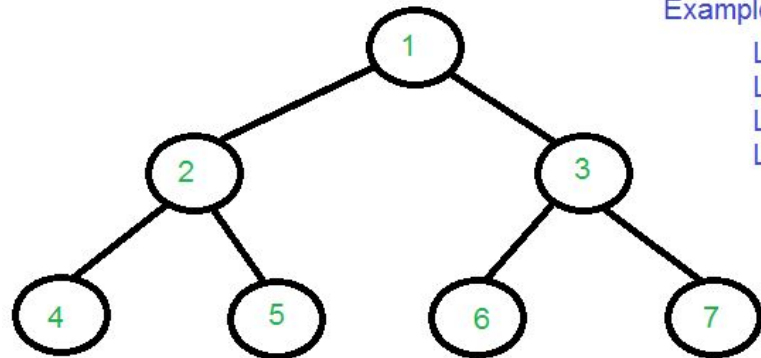


- Species level assignment is not always possible.
- Possibility of hits in different species
- Ambiguities solved by LCA (Lowest Common Ancestor) algorithm.

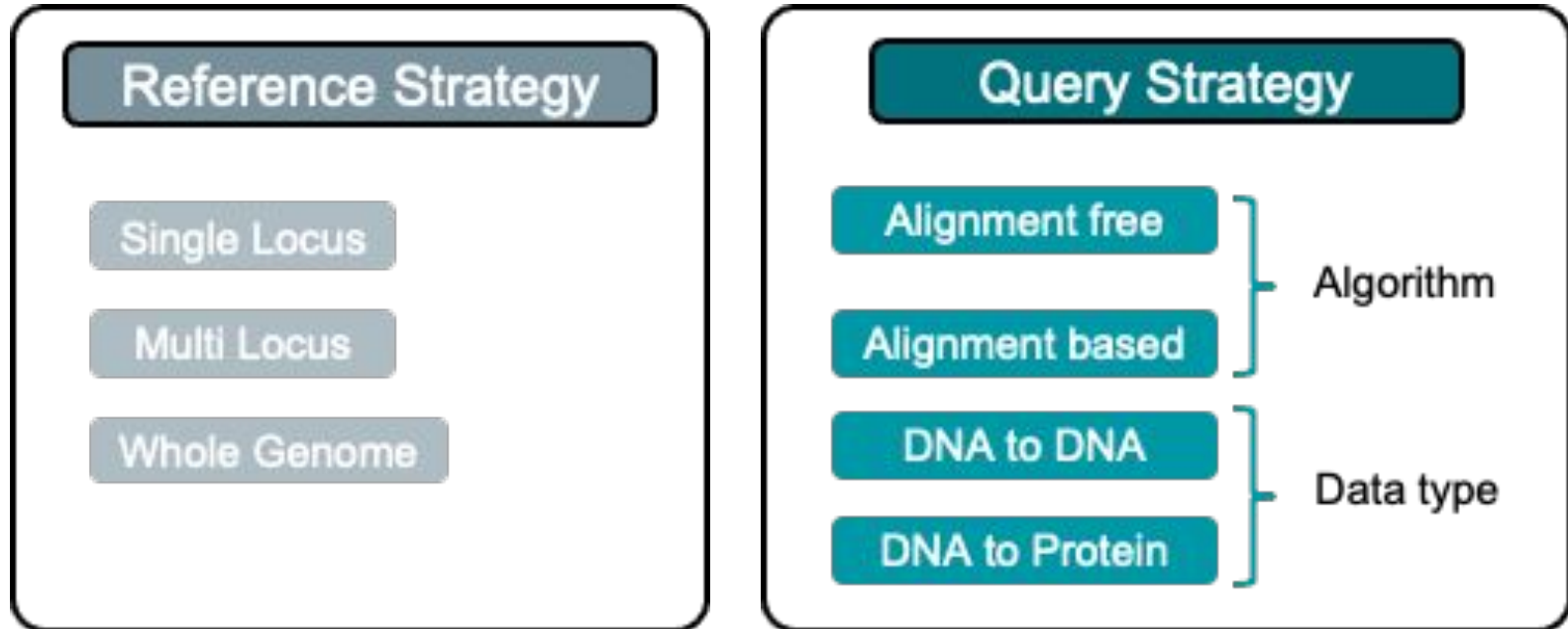


## Examples

$$\begin{aligned} \text{LCA}(4, 5) &= 2 \\ \text{LCA}(4, 6) &= 1 \\ \text{LCA}(3, 4) &= 1 \\ \text{LCA}(2, 4) &= 2 \end{aligned}$$



# Different taxonomic profilers



[maximeborry.com/courses](https://maximeborry.com/courses) : “Taxonomic classifiers and sequence alignment algorithms”



# (most common) taxonomic profilers used in aDNA

## Kraken2

- No alignment
- Fast
- Lower specificity (more false positives)

## MetaPhlAn

- Custom curated marker database
- Reasonably fast
- Good balance between specificity and sensitivity

## MALT

- Alignments
- Slower
- Resource hungry
- Best balance between specificity and sensitivity

Taxonomic profilers benchmark (and more): [CAMI challenge](#)

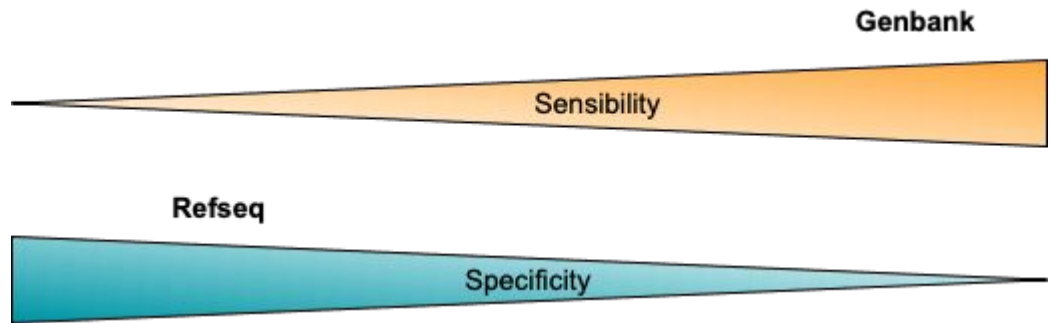




# Reference databases

## NCBI databases

- NCBI nr/nt
  - the largest database
- NCBI RefSeq
  - A curated subset



## Custom databases

- Metaphlan: clade specific markers



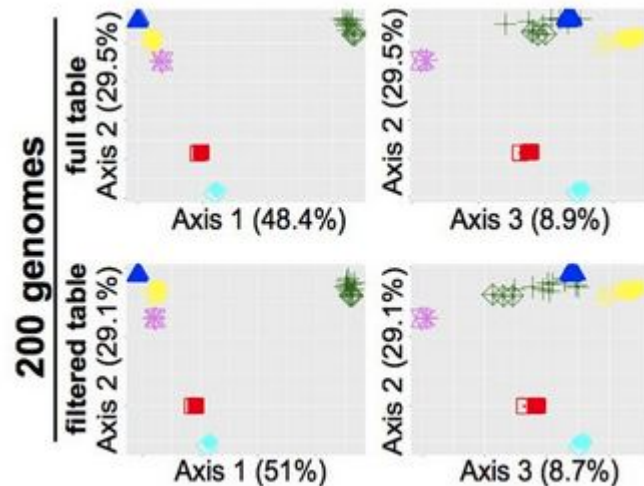
# How is aDNA microbiome different from “modern” microbiome analysis ?

- **We have to show our sample is what we claim it to be:**
  - **time period**
    - Is it actually ancient ?
      - Isotopic dating
  - **source**
    - Is it from the correct host ?
      - microbiome profile, host DNA
    - Is it from the correct ecological niche ?
      - microbiome profile
  - **contamination**
    - How much of the sample is endogenous ?
      - taxonomic composition of bacteria carrying deamination damage
    - Is there a lot of modern contamination (excavation, lab, ...) ?
      - taxonomic composition of non deamination damaged bacteria



# How does aDNA damage affect taxonomic profiling ?

Damage isn't really an issue



PCoA of simulated community composition with Weighted-Unifrac Distance

Ancient: \* True + QIIME/UCLUST ◆ MALT ▲ MetaPhlAn2 ● MIDAS ■ CLARK-S  
Modern: \* True ◆ QIIME/UCLUST ◇ MALT ▲ MetaPhlAn2 ● MIDAS ■ CLARK-S

[Velsko, Irina M., et al. "Selection of appropriate metagenome taxonomic classifiers for ancient microbiome research." \*Msystems\* 3.4 \(2018\): e00080-18.](#)

But very short sequences are more problematic





# The problem with short sequences

## Ambiguity in taxonomic assignation

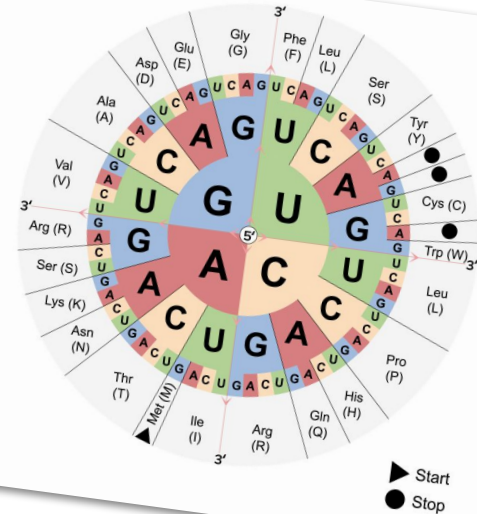
sequence 1 ATGGTCGGGCAGGACGTTGCGAGT  
sequence 2 CGAGAAAGGCAGGACGCCACGTAC



ATGGTCGGGCAGGACGTTGCGAGT



CGAGAAGGCAGGACGCCACGTAC



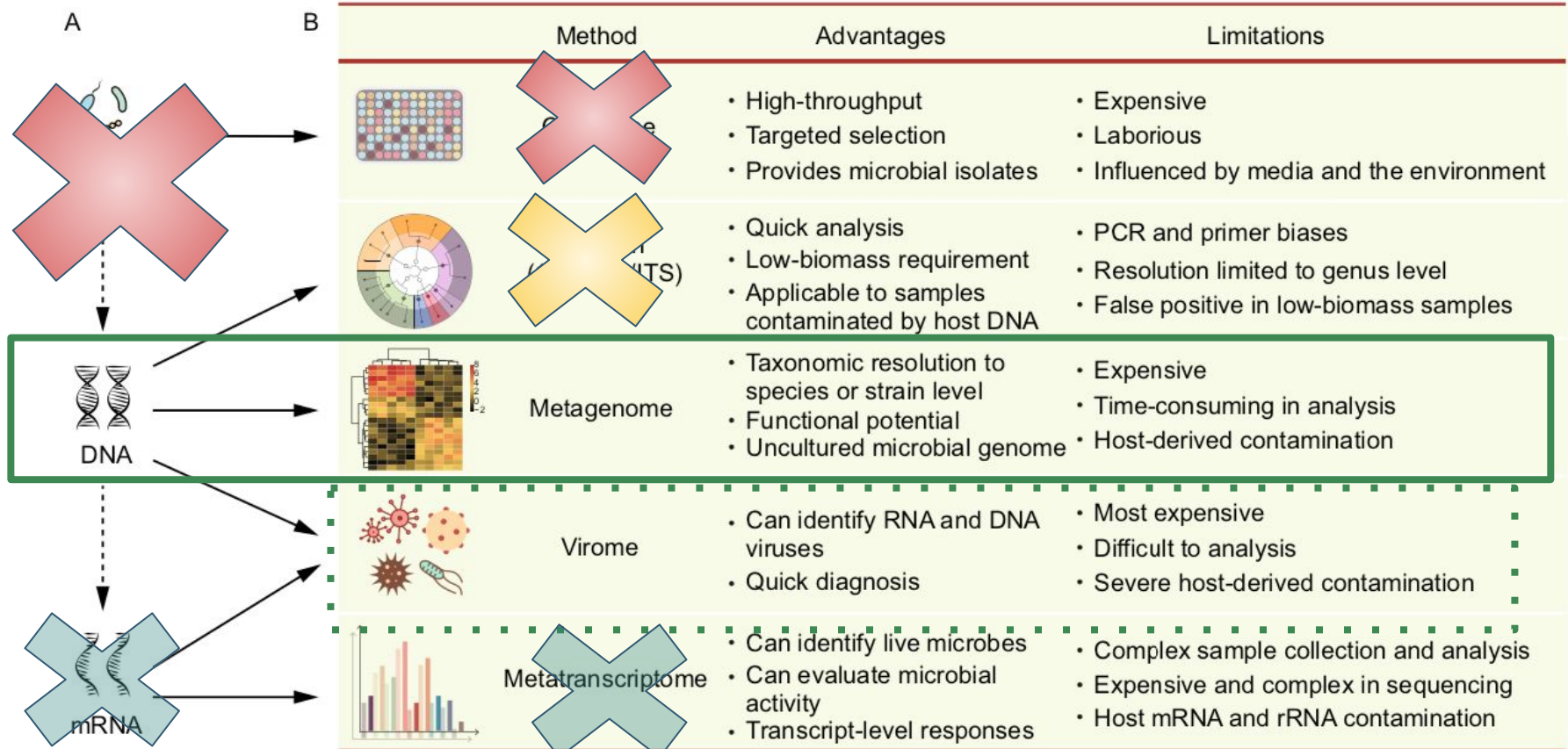
3 DNA bases = 1 amino acid

- 16s rRNA amplification/sequencing is not very good
- Protein alignment is not good enough for very short sequences

[Velsko, Irina M., et al. "Selection of appropriate metagenome taxonomic classifiers for ancient microbiome research." \*Msystems\* 3.4 \(2018\): e00080-18.](#)  
[Orlando, Ludovic, et al. "Ancient DNA analysis." \*Nature Reviews Methods Primers\* 1.1 \(2021\): 1-26.](#)



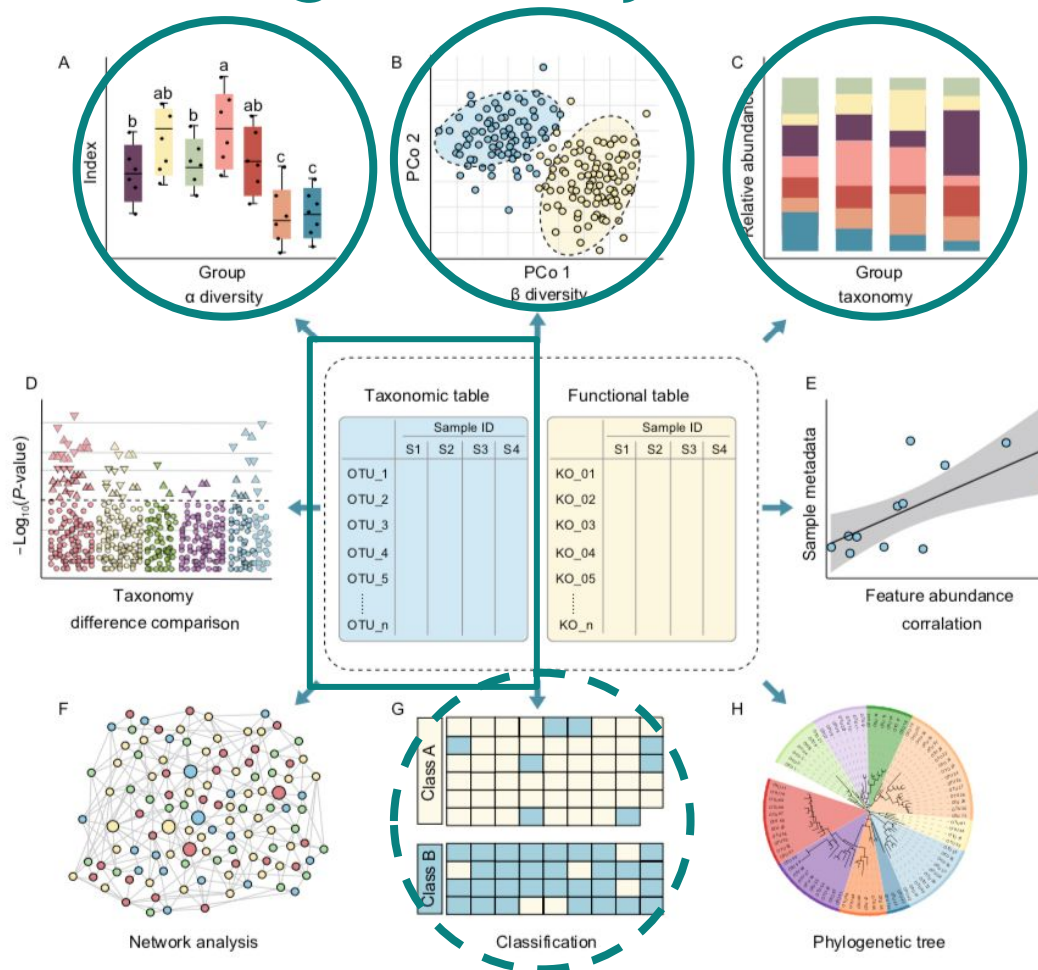
# aDNA vs modern microbiome



Liu Y-X, Qin Y, Chen T, Lu M, Qian X, Guo X, Bai Y. 2021. A practical guide to amplicon and metagenomic analysis of microbiome data. *Protein & Cell* 12:315–330. DOI: [10.1007/s13238-020-00724-8](https://doi.org/10.1007/s13238-020-00724-8).



# What will we get today ?



Liu Y-X, Qin Y, Chen T, Lu M, Qian X, Guo X, Bai Y. 2021. A practical guide to amplicon and metagenomic analysis of microbiome data. *Protein & Cell* 12:315–330. DOI: [10.1007/s13238-020-00724-8](https://doi.org/10.1007/s13238-020-00724-8).





# Questions and tutorial !

[tinyurl.com/microbiometutorial](https://tinyurl.com/microbiometutorial)



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