

Metabarcoding Pipeline Building

An introduction with hands on exercises
CUSO – DPEE Activity

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Starting point

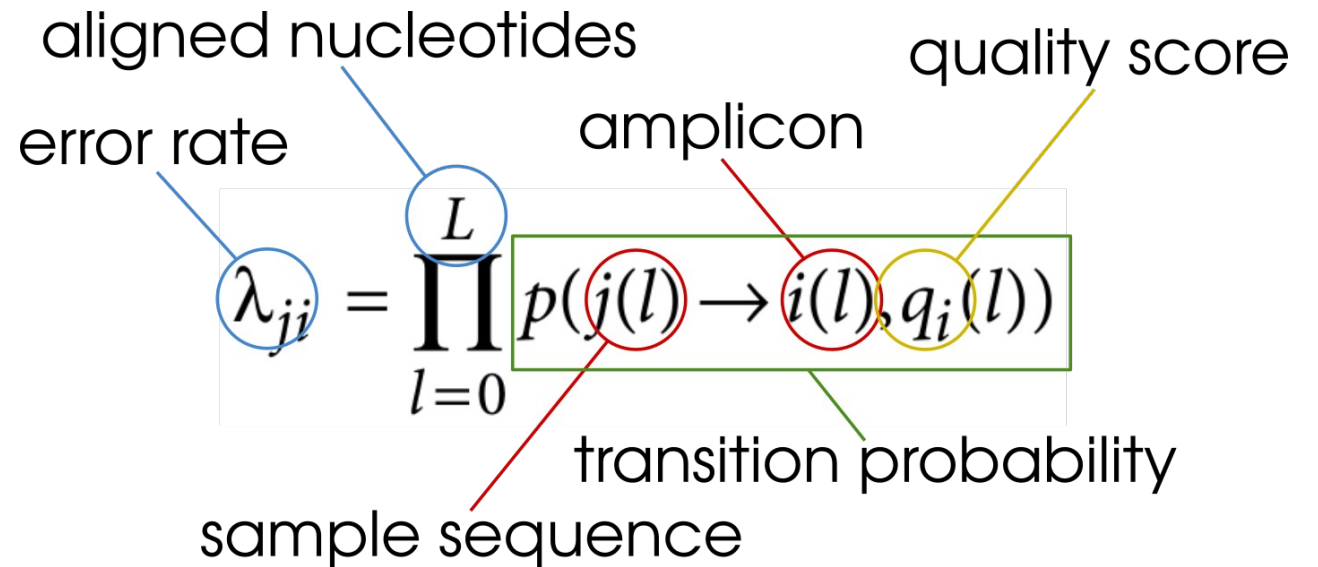


- Demultiplexed samples without technical sequences
- Matching order of forward and reverse reads between FASTQ files

[Callahan et al. 2016](#)

Error model

- Alignment
- Error model
 - Transition probability ~ original nucleotide, substituting nucleotide and associated quality score



[Callahan et al. 2016](#)

Error model

- Abundance p -value p_A
 - Excludes all singletons

$$p_A(j \rightarrow i) = \frac{1}{1 - \rho_{\text{pois}}(n_j \lambda_{ji}, 0)} \sum_{a=a_i}^{\infty} \rho_{\text{pois}}(n_j \lambda_{ji}, a)$$

Diagram illustrating the components of the equation:

- n_j : expected # reads of j
- λ_{ji} : abundance
- $\rho_{\text{pois}}(n_j \lambda_{ji}, a)$: Poisson density function

[Callahan et al. 2016](#)

Divisive Amplicon Denoising Algorithm

- (1) Unique sequences into one partition
- (2) Center = most abundant sequence
- (3) All unique sequences are compared to their center, error rates & p_A are calculated
- (4) If p_A is small enough, its sequence forms a new partition
- (5) All unique sequences join the partition most likely it has produced it
→ back to (3) etc.

[Callahan et al. 2016](#)

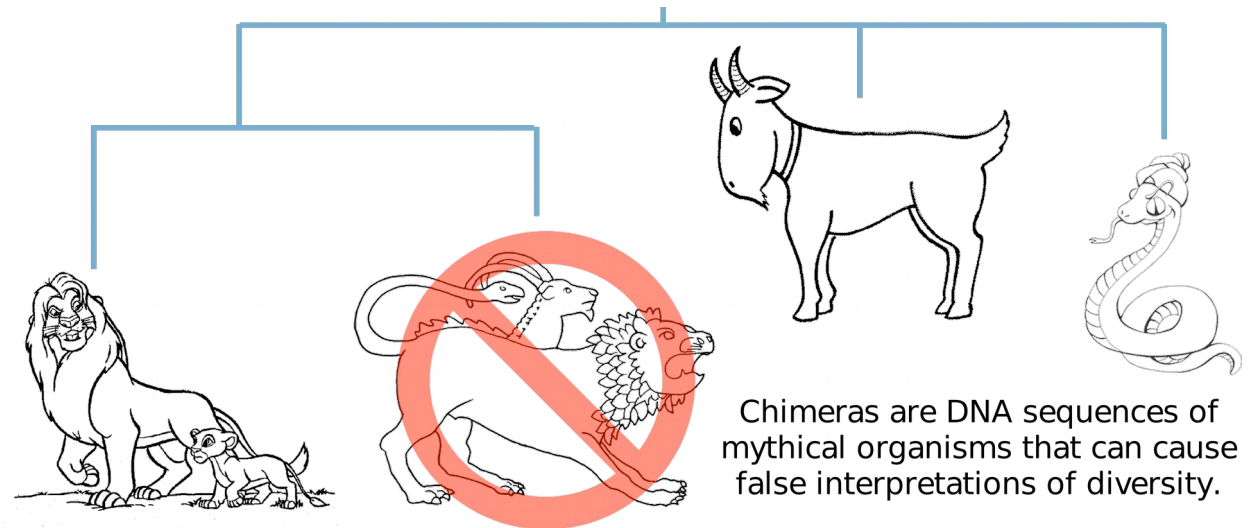
Merge paired reads & construct ASVs

- Aligns the denoised forward reads with the reverse-complement of the corresponding denoised reverse reads → “contigs”
- Default: 12 matching and overlapping nucleotides
- Although not recommended, non-overlapping reads are supported

[Callahan et al. 2016](#)

Chimera detection

- If reconstruction of a contig is possible by combining a left- and a right-segment from two more abundant “parent” sequences, it is considered as chimera



[Wright et al.](#)

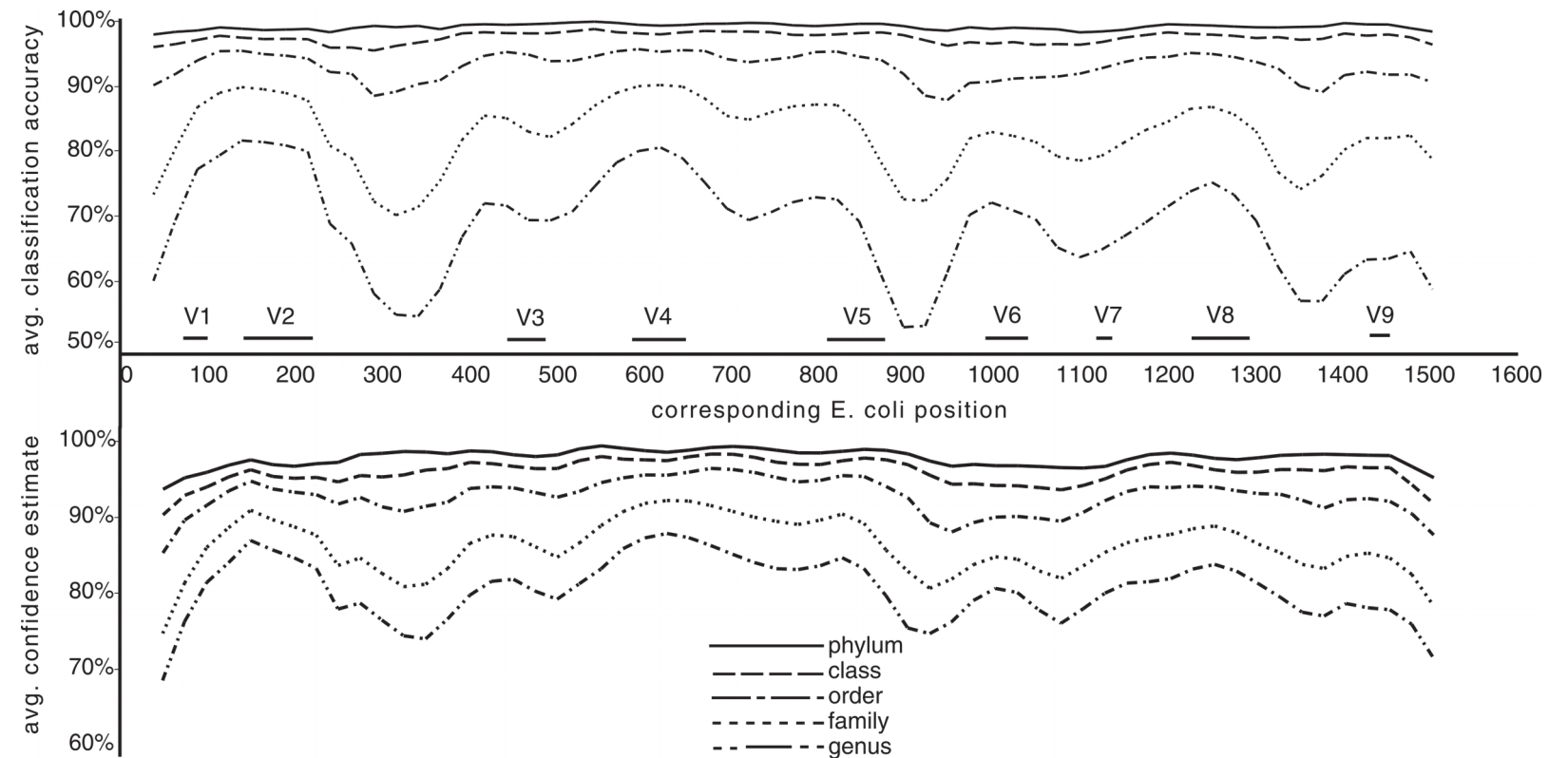
Assign taxonomy

- Classifiers
 - RDP classifier
 - IDTAXA

[Wang et al. 2007, Murali et al. 2018](#)

RDP classifier

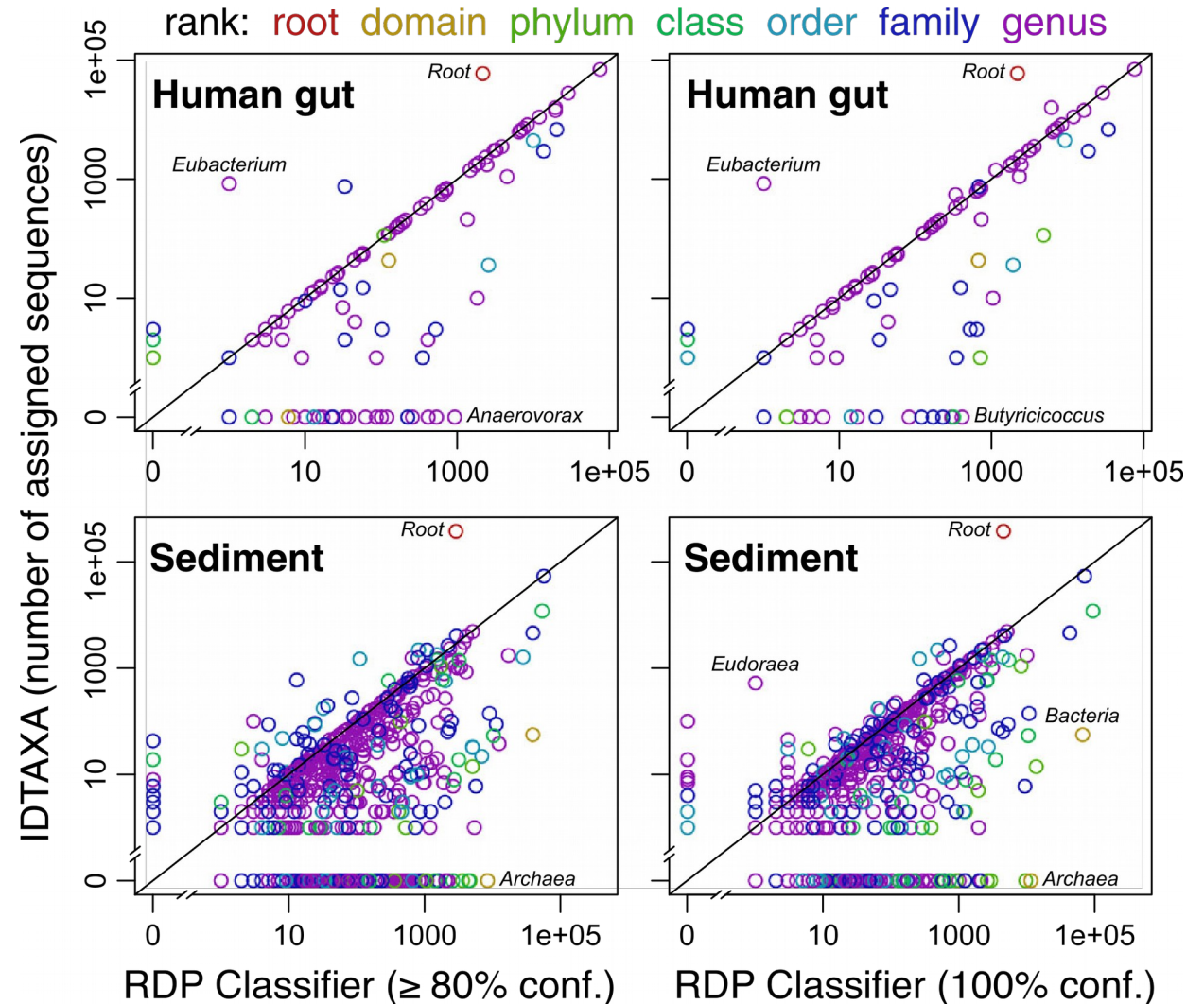
- Ribosomal Database Project Classifier
- Naïve Bayesian classifier



[Wang et al. 2007](#)

IDTAXA

- DECIPHER R package
- Hybrid classification combining phylogenetic, distance-based and machine learning techniques
- Reduced over classification



[Murali et al. 2018](#)

Assign species

- Exact string matching = 100 % sequence identity necessary