

# Bioinformatics D: Amplicon Sequencing

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# Overview

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- Designing PCR primers
- Measuring microbiomes and metagenomes
- Characterizing diversity
- Quantifying with species composition

# Dos and Don'ts of primer selection

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- Do employ primers melting at similar temps.
- Do design target-*specific* primers.
- Do design *efficient* primers (near 2x)
- Do not inhibit *Taq* DNA polymerase.
- Do not allow substantial homology among primer sequences.

# Interaction Challenges of PCR primer design

A-C. Primer-Primer Interactions

D. Hairpin structures

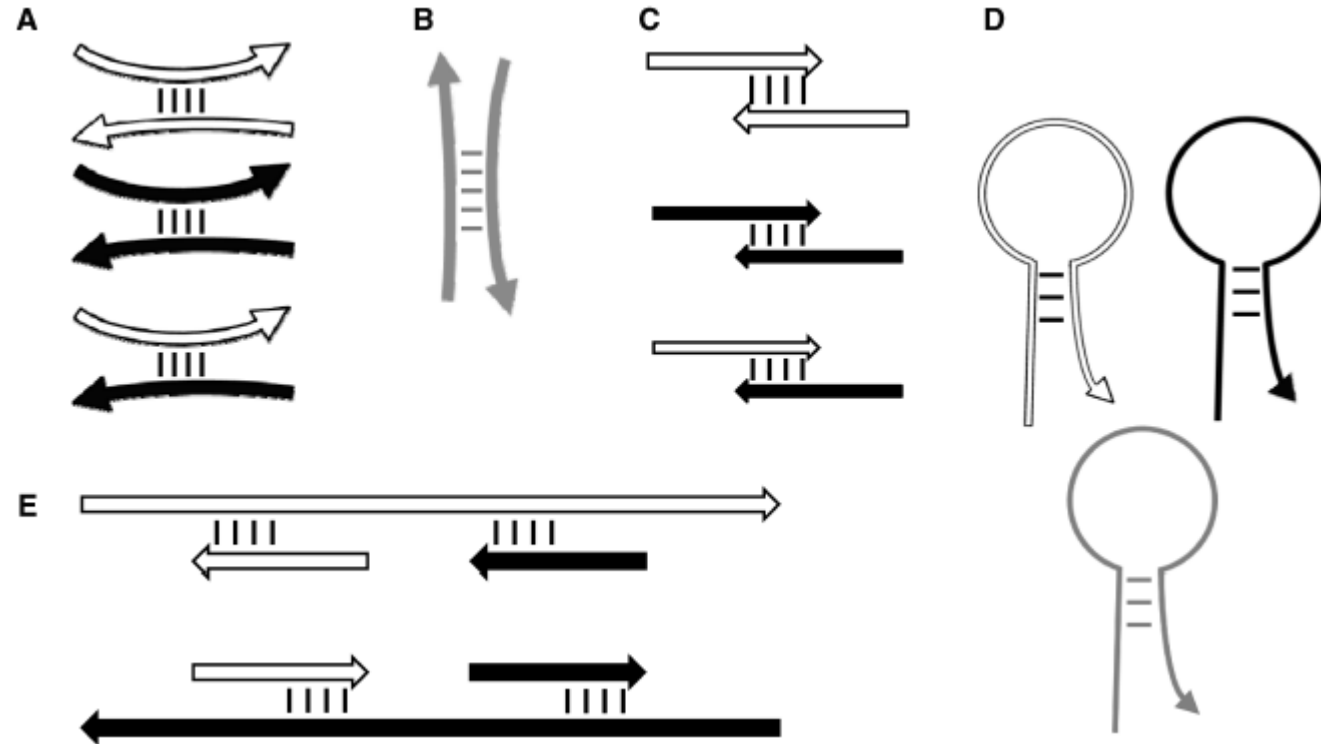
E. Primer-Template Interactions

White: Forward primer

Black: Reverse primer

Both internal and end interactions are possible

Challenge rises as number of primers increases.



# Two key software implementations

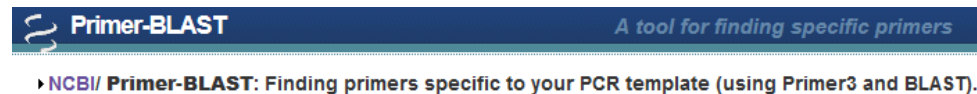
## OLIGO VERSION 7

- Also useful for siRNA and restriction analysis
- <http://www.oligo.net/>
- W. Rychlik and RE Rhoads. *Nucl. Acids Res.* (1989) 17: 8543-8551.



## PRIMER3WEB VERSION 4.0.0

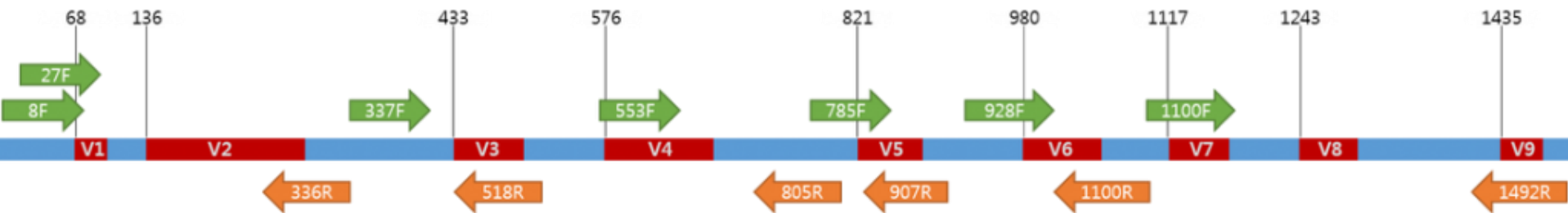
- Engine behind NCBI Primer-BLAST
- [http://bioinfo.ebc.ee/mp\\_rimer3/](http://bioinfo.ebc.ee/mp_rimer3/)
- S. Rosen and H. Skaletsky. (2000) ISBN 978-1-59259-192-3



# Characterizing microbiomes

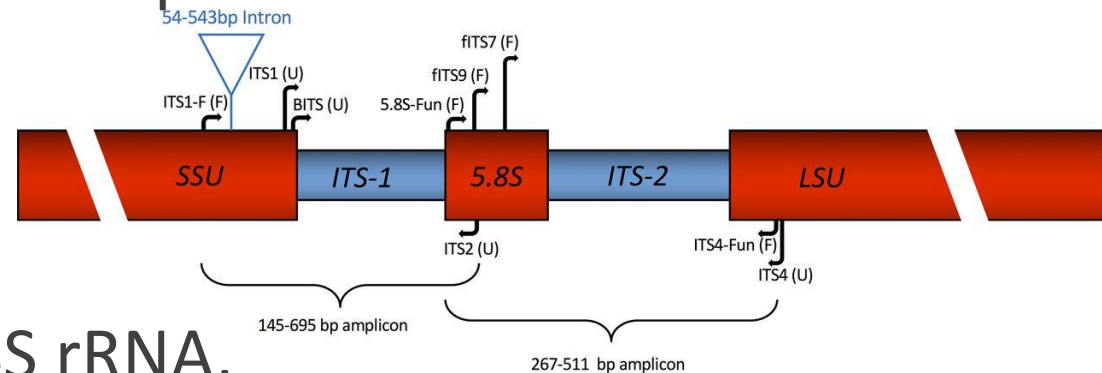
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# Different taxa, different target



[help.ezbiocloud.net/16s-rrna-and-16s-rrna-gene/](http://help.ezbiocloud.net/16s-rrna-and-16s-rrna-gene/)

- Bacteria: 16S rRNA and cpn60



- Fungi: 18S rRNA, 28S rRNA, and Internal Transcribed Spacer

R Sinha et al. *Nature Biotech.* (2017) 35: 1077-1086

DL Taylor et al. *Appl. and Enviro. Microbio.* (2016) 82: 7217-7226

# Key definition for amplicon sequencing

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- Operational Taxonomic Unit: a cluster of **97% similar** sequences, represented by a single consensus sequence.
- Natural sequence variation within species and sequencing errors may yield variation. We must allow for sequence variety.
- Each OTU is a different species; *we may only recognize its phylum, class, or order.*





# Reference taxonomies for 16S

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- Ribosomal Database Project (1997) has grown to 3.3M 16S and 126K 28S rRNAs.
- Greengenes (2006) drew attention to removal of chimeric sequences from DB.
- SILVA (2007) grew from ARB toolkit, dividing into small and large subunit sequences.



**GREENGENES**  
The 16S rRNA Gene Database and Tools



BL. Maidik et al. *Nucl. Acids Res.* (1997) 25: 109-110.

TZ. DeSantis et al. *Appl. and Enviro. Microbio.* (2006) 72: 5069-5072.

E. Pruesse et al. *Nucl. Acids Res.* (2007) 35: 7188-7196.

# Open-ended technologies

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- Metagenomics: sequence random inserts from all DNA in a community of microbes.
- Metatranscriptomics: sequence random cDNA from all mRNA in a community.

*“What are these bacteria capable of and what are they doing?”*

# Diversity and Quantitation

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# Estimating diversity

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“Compositional differentiation and similarity of groups is often analysed by partitioning a regional or ‘gamma’ diversity measure into *within*- and *between*-group components, ‘alpha’ and ‘beta’.”

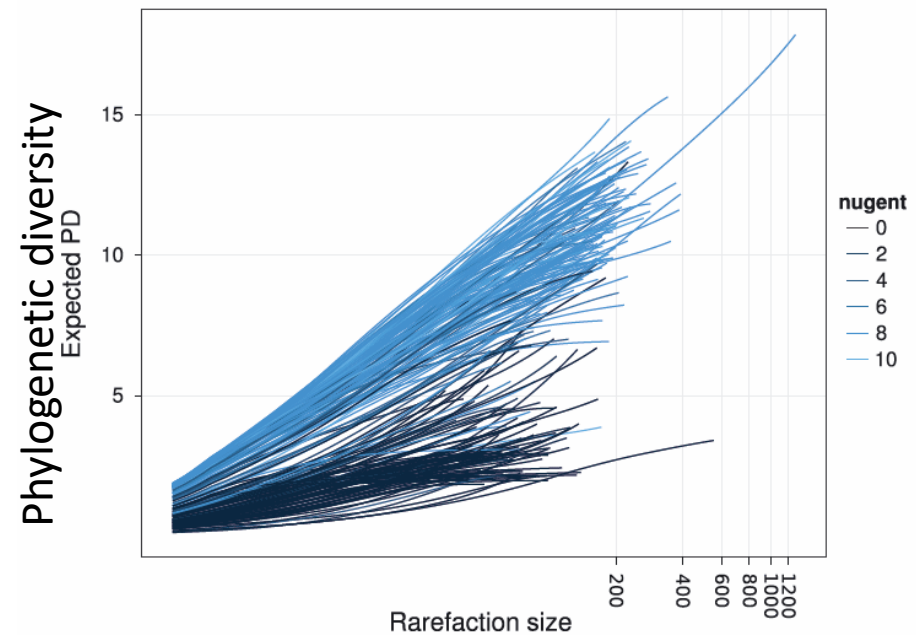
- $\alpha$ : diversity within samples of a single cohort
- $\beta$ : diversity among cohorts of samples
- $\gamma$ : diversity of the population

Jost et al. *Diversity and Distns* (2010) 16:65-76.

Human Microbiome Project. *Nature* (2012) 486: 207-214.

# Did I sequence enough reads?

- Rarefy: “take a random subset of a given size of the original sample”
- “Rarefaction curves can be used to understand the depth of sampling of a community compared with its total diversity.”



**Fig. 5.** Rarefaction curve of samples from Srinivasan *et al.* (2012). The Nugent score is a diagnostic score for bacterial vaginosis, with 0 being ‘normal’ and 10 being classified as BV.

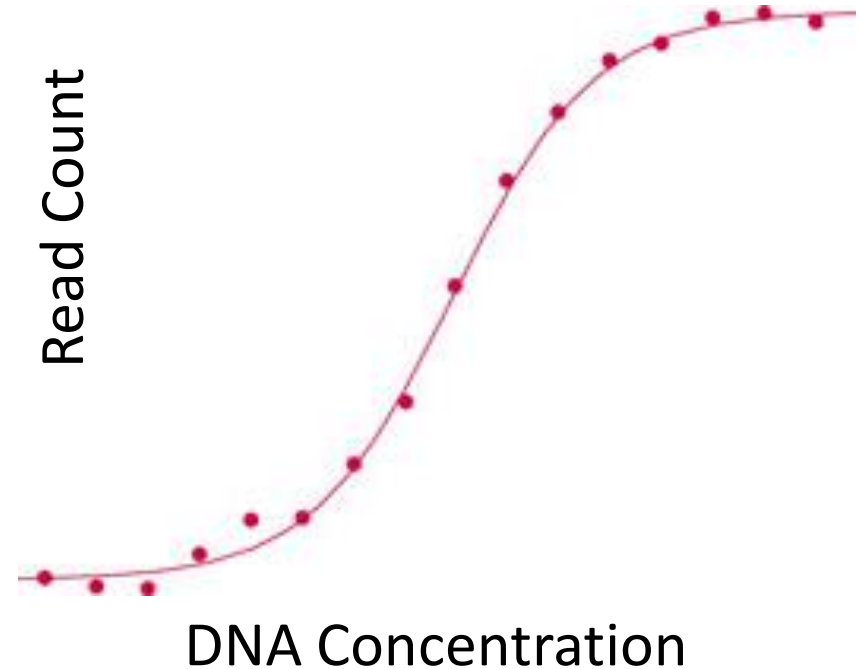
# Case studies in amplicon quantitation

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- What fraction of the *M.tb* microbes in sputum are resistant to TB drugs?
- In this tumor, is the fraction of key genes containing mutations changing over time?
- Do species change in dominance within this bacterial community as a function of pH?

# Calibration curves

- Zero reads do not imply total absence of target sequence (Level of Detection).
- Read count does not rise linearly with too few or too many sequence copies (Level of Quantitation).



We call this a “sigmoid” curve.



# Why else might read counts mislead us?

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- Different target sequences have different primer efficiencies.
- Sequencing errors may cause us to believe sequence variants exist that do not.
- Stochastic noise may cause us to believe cohorts are different when they are not.

# Takeaway messages

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Bioinformatics tools support key activities in amplicon sequencing:

- Selecting PCR primers
- Clustering reads to determine distinct set of sequences
- Annotating sequence clusters with taxonomy information
- Determining the completeness of sequencing
- Quantifying particular sequence variants