



香港中文大學  
The Chinese University of Hong Kong

# Conducting Microbiome study, a How to guide

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Joint Graduate Seminar

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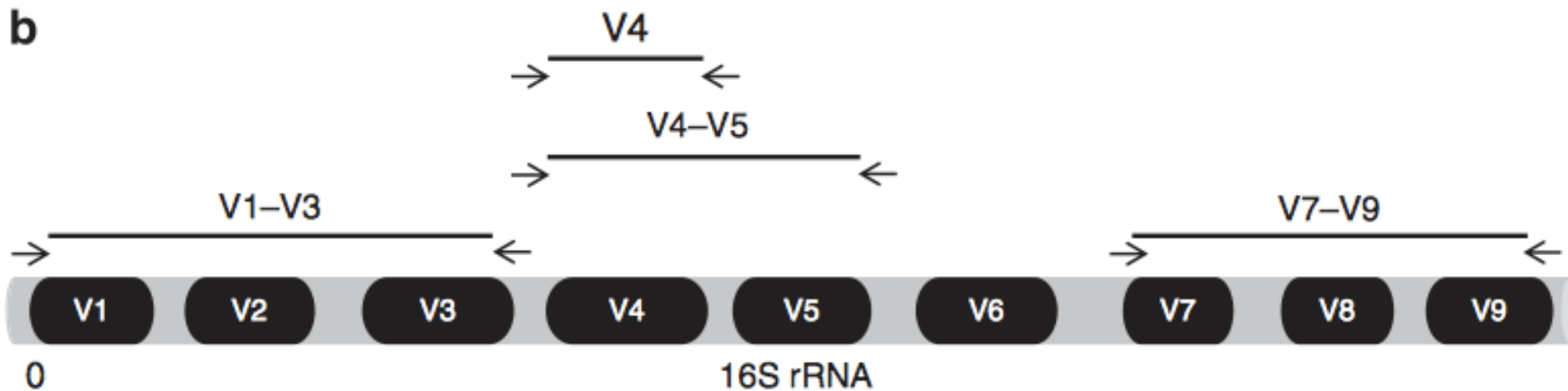
# Why study Microbiome?

- ✓ Essential component, e.g. Gut microbes
- ✓ Disbiosis (microbial imbalance) & disease
  - *Obesity, diabetes, inflammatory bowel disease*
- ✓ Limitation of traditional culture methods.

# 16S rRNA gene

- Metagenomic Study methods based on:
  - **16S rRNA gene** or *Whole Genome Sequencing*
- 16S rRNA gene is widely accepted, because:
  - ✓ *9 hypervariable regions (Identification, phylogenetic)*  
*+ highly conserved regions (universal primers binding);*
  - ✓ *Well-developed processing procedure;*
  - ✓ *Database is mature: e.g. Ribosomal Database Project (RDP)...*

# 16S rRNA



Black: hypervariable region

Grey: conserved region

Tyler A D, The American journal of gastroenterology, 2014, 109(7): 983-993.

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# Ongoing Microbiome Project



NIH HUMAN  
MICROBIOME  
PROJECT



# Workflow of Microbiome Study

1. Study Design

2. Sample Preparation

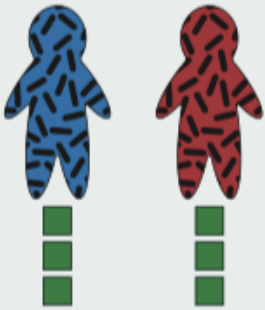
3. Library Preparation & Sequencing

4. Sequence Analysis

5. Statistical Analysis

# Study Design

High sequencing depth reveals rare features within each sample



Reduced depth enables larger sample sizes (greater statistical power)



Time courses within communities reveal changes in response to stimuli and other dynamical properties



- Exclusion Criteria?
- Control group?
- Sampling methods?

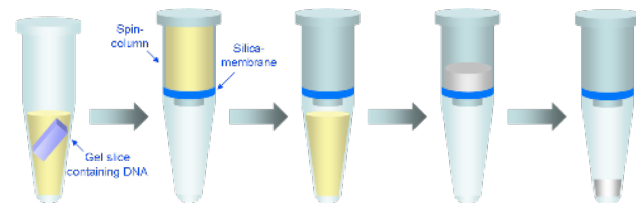
■ One 'unit' of WMS sequencing

Franzosa E A, Nature Reviews Microbiology, 2015.



## 2. Sample preparation

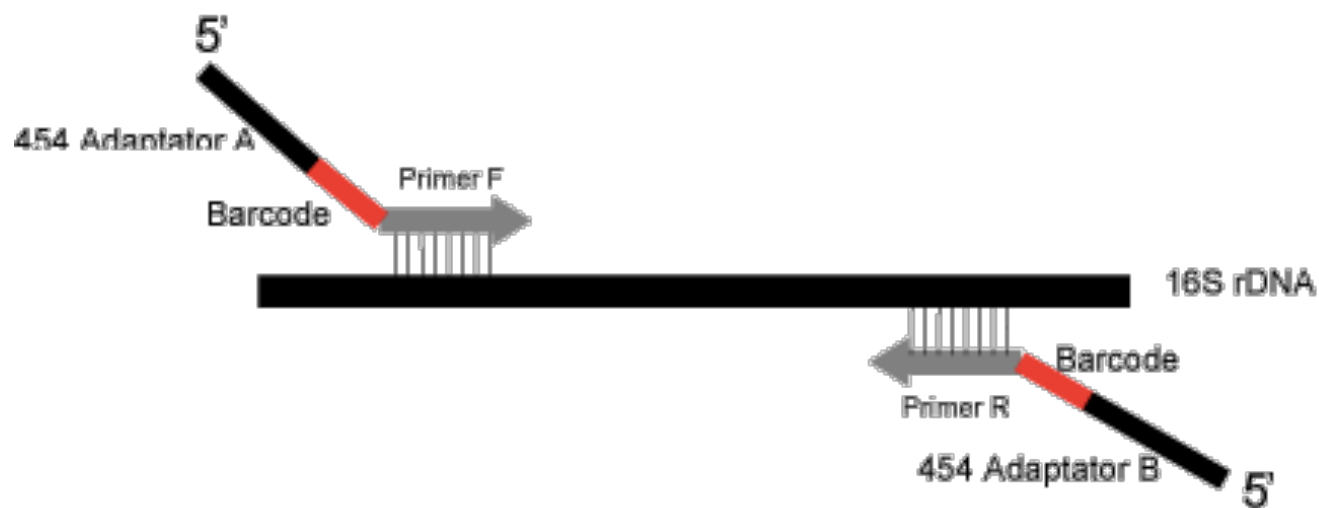
- 1) Storing: immediate freezing, storage at  $-80^{\circ}\text{C}$ .
  - *Minimize freeze-thaw cycles.*
- 2) DNA extraction: commercially available kits specific to the sample type. (Caution: Run a blank extraction control!)



<http://biotechcrunch.blogspot.hk/2011/11/9-factors-affecting-dna-extraction-from.html>

# 3. Library preparation (PCR)

## 16S Primers & Barcode & adaptor



Fabrice A, J Comput Sci Syst Biol, 2009, 2(1): 074-92.

# 3. Sequencing

- **Platform:** Illumina MiSeq & Ion torrent

Platform	Cost per run	Read Length	Run time	Throughput
Ion torrent (318 chip)	\$625	100 bases	3h	1000Mb
MiSeq	\$750	150*2 bases	27h	1500Mb



**Ion torrent**



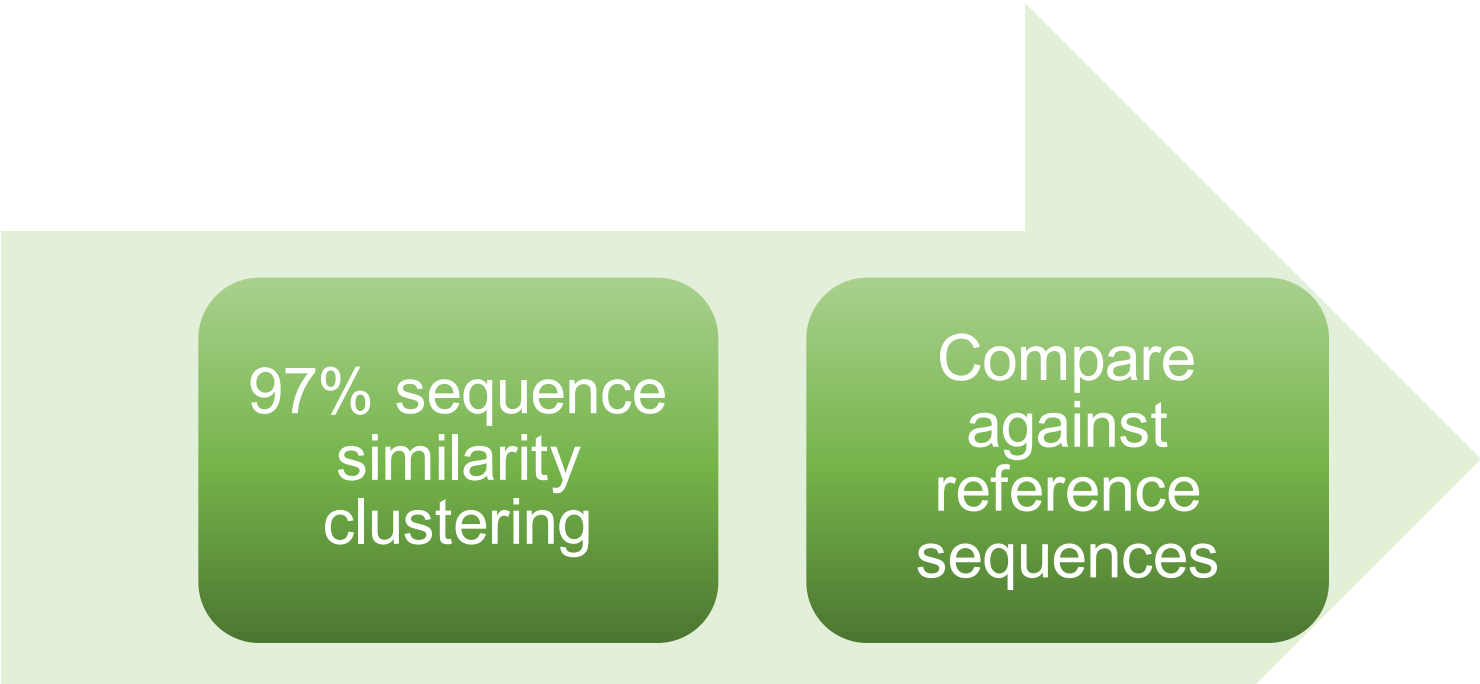
**MiSeq**

Loman N. Nature biotechnology, 2012, 30(5): 434-439.

# 4. Sequence Analysis

- **Software packages:** QIIME, mothur
- **Steps:**
  1. Sequence Quality Control
    - ✓ *Trimming adaptors*
    - ✓ *Filtering low quality sequence*
    - ✓ *Filtering Chimeras (5%~45%)*
  2. Taxonomic identification
    - Operational Taxonomic Units (OTUs) Analysis

# Operational Taxonomic Units (OTUs) Analysis



97% sequence  
similarity  
clustering

Compare  
against  
reference  
sequences

\* Database: Ribosomal Database Project (RDP)...

# 5. Statistical Analysis: Measure of Diversity

## Relative abundance:

- Quantitative measure
- Frequency of a specific taxon

## Alpha diversity:

- Measure of diversity **within** a sample
- Calculated by algorithms

## Beta diversity:

- Comparison of diversity **between** samples
- Displayed as Principle Coordinate Analysis (**PCoA**) plot

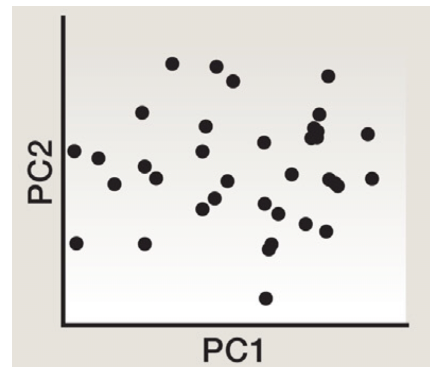
# Principle Coordinate Analysis (PCoA) plot

- Microbiome data:

*Multi-dimension, each species = one dimension*

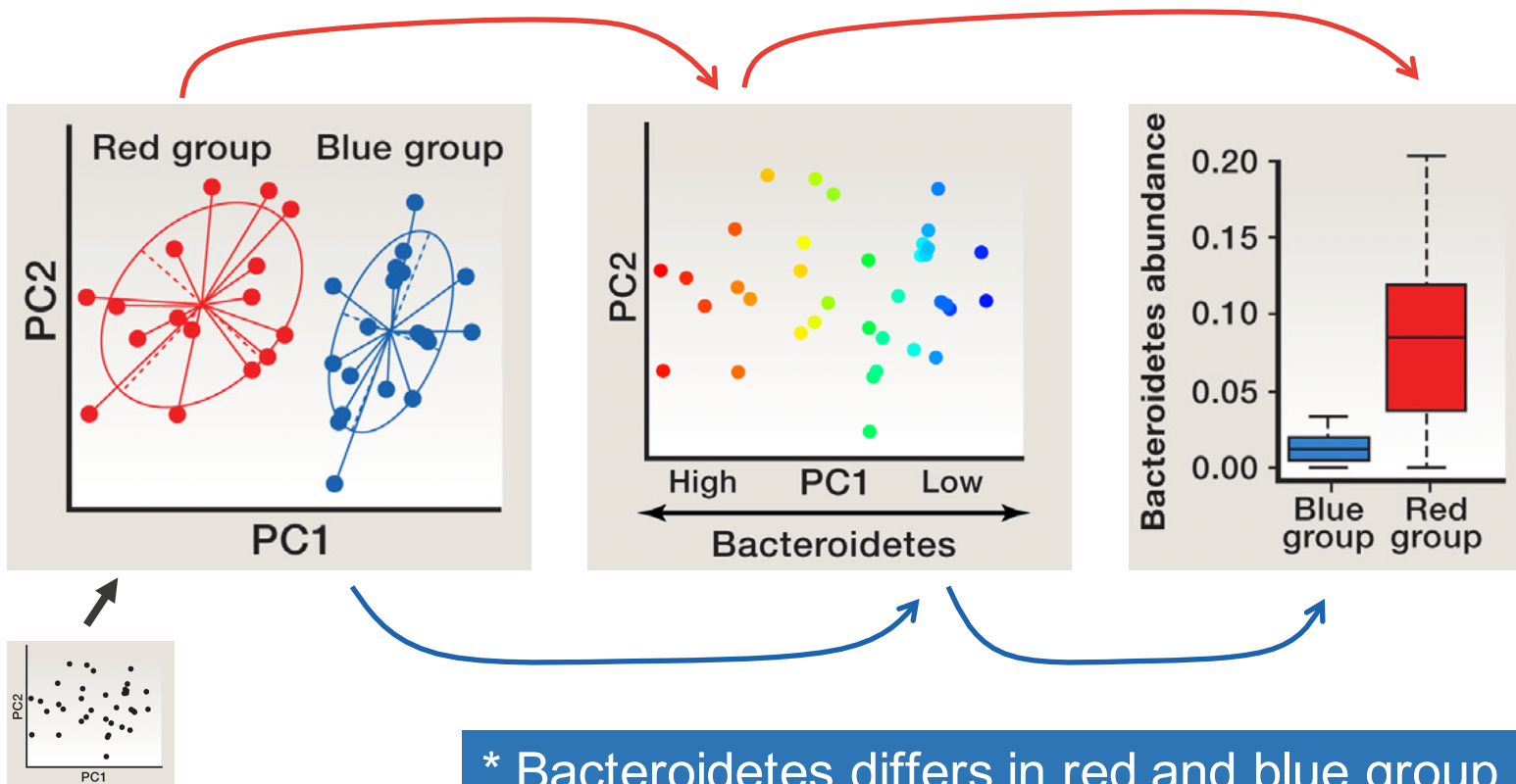
- Mathematically reduce them to two/three dimensions:

## Principle Coordinates (PC)



**Data visualization: PCoA plot**  
\*each dot= a sample

# Principle Coordinate Analysis (PCoA) plot

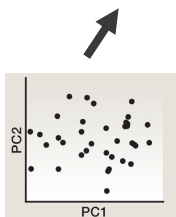
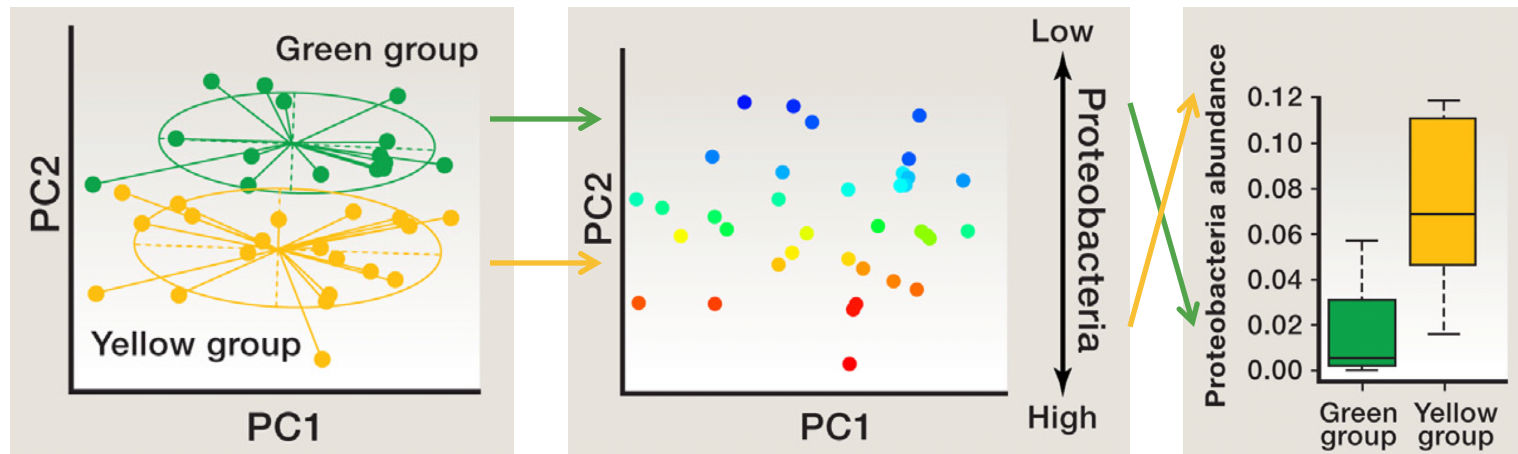


**\* Bacteroidetes differs in red and blue group**

Goodrich J K, Cell, 2014, 158(2): 250-262.



# Principle Coordinate Analysis (PCoA) plot

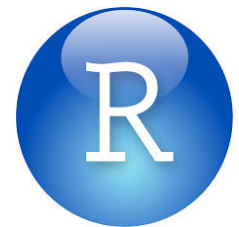


\* Proteobacteria differs in green and yellow group

Goodrich J K, Cell, 2014, 158(2): 250-262.

# 5. Statistical analysis: Regression Analysis

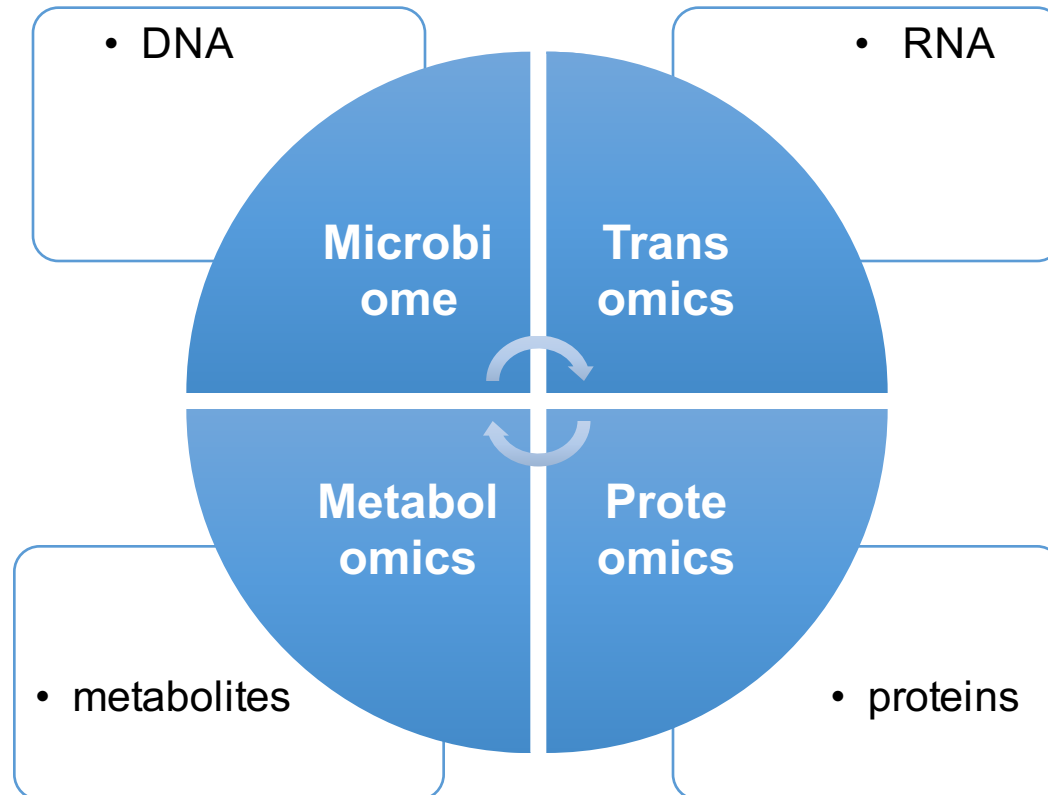
- **Response variables:** alpha diversity, PCs, the abundances of OTUs
- **Statistical models:** Multiple Logistic Regression...
- **Control cofounding factors:**  
*maternal effects, gender, age, sex, technical sources of variation, season.....*



# Future

- **Limitations of 16s rRNA gene based methods:**
  - Species level
  - Can't observe dynamic changes of different conditions
- **Future:**
  - **Multi-omic data** to measure functional activity under given condition

# Multi-Omic data



# Reference

1. Goodrich J K, Di Rienzi S C, Poole A C, et al. Conducting a microbiome study[J]. *Cell*, 2014, 158(2): 250-262.
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3. Tyler A D, Smith M I, Silverberg M S. Analyzing the human microbiome: a “how to” guide for physicians[J]. *The American journal of gastroenterology*, 2014, 109(7): 983-993.
4. Franzosa E A, Hsu T, Sirota-Madi A, et al. Sequencing and beyond: integrating molecular'omics' for microbial community profiling[J]. *Nature Reviews Microbiology*, 2015.
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6. Loman N J, Misra R V, Dallman T J, et al. Performance comparison of benchtop high-throughput sequencing platforms[J]. *Nature biotechnology*, 2012, 30(5): 434-439.
7. Larsen N, Vogensen FK, van den Berg FW et al. Gut microbiota in human adults with type 2 diabetes differs from non-diabetic adults. *PLoS One* 2010;5:e9085.
8. Bahl MI, Bergstrom A, Licht TR. Freezing fecal samples prior to DNA extraction affects the Firmicutes to Bacteroidetes ratio determined by down- stream quantitative PCR analysis. *FEMS Microbiol Lett* 2012;329:193–7.

**Thank you!**  
**Q&A**

The logo for the University of Colorado (CU) is positioned at the bottom of the slide. It features the letters 'c' and 'u' in a white, lowercase, sans-serif font. The 'c' is on the left and the 'u' is on the right, both set against a dark purple background. The background of the entire slide is composed of several overlapping, rounded shapes in shades of purple and green, creating a layered, abstract effect.

**cu**