### **Metagenomics and Metatranscriptomics**

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### Microbes

### Microbiomes

### **Community Analysis**

### Today

### Metatranscriptomics

**Metagenomics** 



#### Shotgun Sequencing and Metagenomics



#### Benefits and limitations of whole genome shotgun metagenomics vs community analysis

# What do you think?



#### Benefits and limitations of whole genome metagenomics



Benefits

- Integrative meta-omics
- Strain-level profiling
- Longitudinal study design
- Capability of sequencing large regions or entire genome
- Identification of organisms in addition to bacteria, archaea
- Increased prediction of genes and functional pathways

Limitations

- Expensive
- Compute intensive
- Incomplete databases
- Biases in functional profiling
- Unvalidated data in the public space
- Live or dead dilemma



### Sample Prep

Sample collection and DNA extraction

- Sample collection and preservation methods can affect quality and accuracy of metagenomic data
  - Collect sufficient biomass
  - Minimize contamination
  - Enrichment methods where applicable
- DNA extraction methods can affect the composition of downstream sequence data
  - Method must be effective for diverse microbial taxa
    - Mechanical lysis (bead beating) method is considered superior, however, data will be biased for easy-to-lyse microbes
    - Bead beating will result in short DNA fragments and lead to DNA loss during library prep methods.

Sources of contamination

## What do you think?

#### Sources of contamination

- Kit or lab reagents
- Low biomass samples are vulnerable to contamination as there is less 'real' signal to compete with low levels of contamination
  - Use ultraclean kits
  - Include blank sequencing controls
- Cross- over from previous sequencing runs
- PhiX control DNA
- Human/ host DNA

#### Include Controls

- Between run repeat (process any sample in duplicate per run to measure reproducibility across runs)
- Within run repeat (process any sample in duplicate per plate to measure reproducibility)
- Water used during PCR (water blank- to determine if any contaminant was introduced during PCR reaction)
- Water spiked with known bacterial DNA (mock bacterial communities- enables quantification of sequencing errors, minimizes bias during sampling and library preparation )

# Sequencing

#### Coverage and Sequencing considerations

- No published guidelines for 'correct' amount of coverage for a given environment
  - Choose a system that maximizes output in order to recover sequences from as many low-abundance members of the microbiome as possible
  - HiSeq 2500 or 4000, NextSeq and NovaSeq produce high volume data (120Gb- 1.5 Tb per run) – suited for metagenomics study
  - Multiplexing prudently will enable desired per-sample sequencing depth

#### Illumina sequencers and yield

|                  | platform   | read config | 180output                           |
|------------------|------------|-------------|-------------------------------------|
| Production scale | HiSeq 2500 | 2 x 250     | <sup>±00</sup> Gb - <sup>±</sup> Tb |
|                  | HiSeq 4000 | 2 x 150     | 1.5 Tb                              |
|                  | HiSeq X    | 2 x 150     | 1.8 Tb                              |
|                  | NovaSeq    | 2 x 250     | 6 Tb                                |
| benchtop 🗕       | NextSeq    | 2 x 150     | 120 Gb                              |
|                  | MiSeq      | 2 x 300     | 15 Gb                               |
|                  | lseq       | 2 x 150     | 1.2 Gb                              |
| L                | MiniSeq    | 2 x 150     | 7.5 Gb                              |

#### Long reads

PacBio

### Increased throughput and lower cost

HiFi (>99% accuracy) versus CLR

Nanopore

Longer (up to 2 MB)

Recent improvements in accuracy

#### ProxiMeta (Hi-C) from Phase Genomics

#### Master the Microbiome

The ProxiMeta Metagenome Deconvolution Platform combines cost-effective proximity ligation data (generated with our optimized kits) with shotgun sequencing data, to assemble high-quality metagenomes and associate mobile genetic elements with their hosts. Capture strain-resolution insights without relying on 16S-based techniques, binning or culturing.



Proximity ligation (Hi-C) libraries are generated from a single mixed microbial sample. Interactions are captured by crosslinking, digesting, and creating chimeric junctions that are sequenced and analyzed with a shotgun assembly to deconvolve chromosomes and plasmids into complete genomes.

From: Stadler, T. et al. The ISME Journal 2019; 13: 2437 - 2446.

#### Data Preprocessing



- Many tools/options to filter and trim data
- Trimming does not always improve things as valuable information can be lost!
- Removal of adapters is critical for downstream analysis



#### Let's go through results

**Basic Statistics** Per base sequence quality Per tile sequence quality Per sequence quality scores Per base sequence content Per sequence GC content Per base N content Sequence Length Distribution Sequence Duplication Levels arrange anted acqueres

https://www.bioinformatics.babraha m.ac.uk/projects/fastq c/Help/3%20Analysis%20Modules/ https://www.bioinformatics.babraha m.ac.uk/projects/fastq\_c/

#### **Different Analysis Modules**

### **Metatranscriptomics**

#### Simplistic Workflow



#### **Metatranscriptomics**



Computational and Structural Biotechnology Journal, 2015



Benefits of Metatranscriptomics vs community analysis or whole genome metagenomics

# What do you think?

#### **Benefits of Metatranscriptomics**

| 16S Sequencing   | Metagenomic analysis   | Metatranscriptome analysis  |
|--|--|---|
| Identifies only a fraction of your gut<br>bacteria; unable to identify nonbacterial<br>microorganisms                          | cannot identify any RNA viruses or<br>RNA bacteriophages   | identifies all microorganisms living in the environment: bacteria, viruses, archaea, yeast, fungi, parasites and bacteriophages |
| Low resolution (mostly genus or lower)   | High resolution (species and strain<br>level), but does not include RNA<br>viruses   | High resolution (species and strains) of all microorganisms   |
| Unreliable; sequencing the same sample twice can yield very different results  | Minimal variation in results, but<br>partially biased analysis (no RNA<br>data)  | Minimal variation in results and unbiased results   |
| Does not measure microbe functions   | Does not measure microbe<br>functions  | capable of providing functional information   |
| unable to identify microbial metabolites,<br>which are key for maintaining health  | unable to identify microbial<br>metabolites, which are key for<br>maintaining health   | identifies which metabolites are being produced and which are missing   |
| Sequences DNA, which can come from say food or dead organisms  | Sequences DNA, which can come from say food or dead organisms  | Sequences RNA, which comes from live microorganisms   |
| low resolution and lack of functional data<br>preclude any actionable recommendations<br>(fopiggနာရေးမှာများရှိများများရေးရေး) | low resolution and lack of<br>functional data preclude any<br><b>rafisch ptornics factor</b> s <b>fen</b><br>therapeutic purposes) | Allows correlation of microbes and their functions with common  |

## Metagenomics

- American Gut Project
- Earth microbiome Project
- Human Oral Microbiome Database
- CardioBiome
- Human Microbiome Studies JCVI
- MetaSub Metagenomics and metadesign of Subways and Urban Biomes
- Gut microbiota for Health
- NASA: Study of the impact of long term space travel in the Astronaut's microbiome
- Michigan microbiome project
- Coral microbiome project
- Seagrass microbiome project
- Brazilian microbiome project
- Home microbiome study







Recovered over 150,000 microbial genomes from ~10,000 metagenomes

70,178 genomes assembled with higher than 90% completeness

3,796 SGBs (species-level genome bins) identified -77% of the total representing species without any publicly available genomes



#### Example Workflow to plan a Metagenomics Study



Understanding the potential for confounding factors, and optimization of design, can substantially improve the quality of both metagenomic sequence data, and interpretation



Nature Biotechnology, 2017

#### **Shotgun Metagenomics**



Metagenomics: Untargeted sequencing of all microbial genomes present in a sample

- Study design and experimental protocol
- Computational pre-processing
- Sequence analysis
- Post-processing
- Validation

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Strengths and weaknesses of assembly-based and read-based metagenomics analysis

# What do you think?

Nature Biotechnol, 2017



# Strengths and weaknesses of assembly-based and read-based metagenomics analysis

|                                     | Assembly-based analysis  | Read-based analysis ('mapping')  |
|-------------------------------------|--|--|
| Comprehensiveness                   | Can construct multiple whole genomes, but only for organisms with enough coverage to be assembled and binned.        | Can provide an aggregate picture of community function or structure, but is based only on the fraction of reads that map effectively to reference databases. |
| Community complexity                | In complex communities, only a fraction of the genomes can be resolved by assembly.                                  | Can deal with communities of arbitrary complexity given sufficient sequencing depth and satisfactory reference database coverage                             |
| Novelty                             | Can resolve genomes of entirely novel organisms with no sequenced relatives.   | Cannot resolve organisms for which genomes of close relatives are unknown.   |
| Computational<br>burden             | Requires computationally costly assembly, mapping and binning.   | Can be performed efficiently, enabling large meta-analyses.  |
| Genome-resolved metabolism          | Can link metabolism to phylogeny through completely assembled genomes, even for novel diversity.                     | Can typically resolve only the aggregate metabolism of the community, and links with phylogeny are only possible in the context of known reference genomes.  |
| Expert manual supervision           | Manual curation required for accurate binning and scaffolding and for misassembly detection.                         | Usually does not require manual curation, but selection of reference genomes to use could involve human supervision.   |
| Integration with microbial genomics | Assemblies can be fed into microbial genomic pipelines designed for analysis of genomes from pure cultured isolates. | Obtained profiles cannot be directly put into the context of genomes derived from pure cultured isolates.  |

Nature Biotechnol, 2017





Generalized workflow of metagenomic next-generation sequencing for diagnostic clinical use





#### Pretreatment methods for metagenomics:

- 1. Microbial separation
- 2. Depletion of host nucleic acid
- 3. Targeted enrichment of pathogen DNA after extraction



#### NGS and pathogen detection

#### Whole genome sequencing workflow

Pathology, 2015

National Center for Genome Resources



- 3. Reference based SNP calling to perform phylogenetic analysis to assist with epidemiological outbreak
- 4. Resulting assembly used for typing and resistance detection
- 5. Closed genome used for further analysis

1.

2.

#### Where we are headed!



Integrated networks for multi omics data



#### **Published studies**

- 1. Whole genome metagenomic or metatranscriptomic?
- 2. What are the samples?
- 3. How many samples?
- 4. How many replicates?
- 5. What sequencing technologies?
- 6. How much sequencing coverage?
- 7. Sample complexity?
- 8. Community structure?
- 9. Assembly?
- 10. Functional?
- 11. Conclusions?