

# Bioinformatics Summer School

## Long-reads Transcriptomics

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Genoscope, Evry-Courcouronnes, France

## 1 Basic concepts of metatranscriptomics

## 2 Experimental design

## 3 Downstream analysis

4

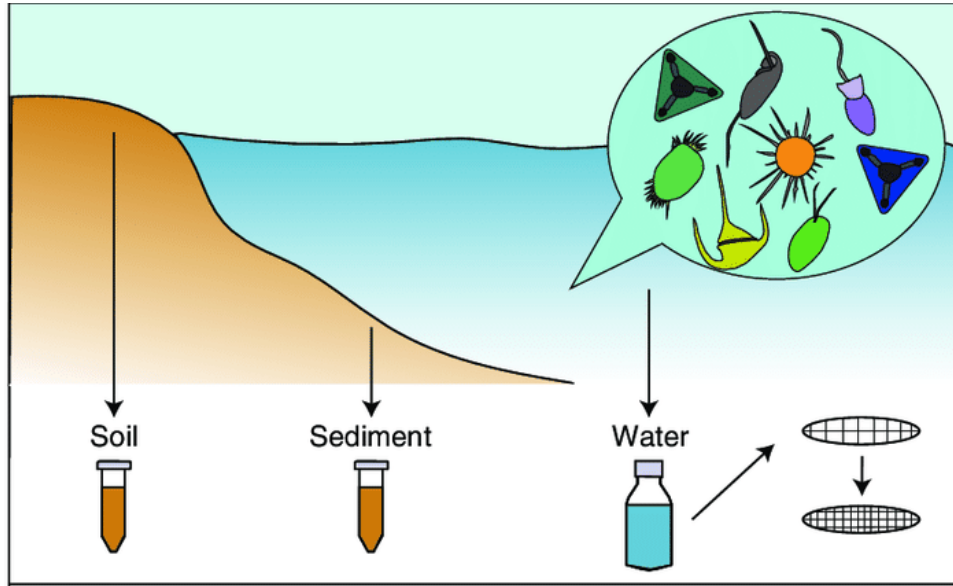
## Section 1

# Basic concepts of metatranscriptomics

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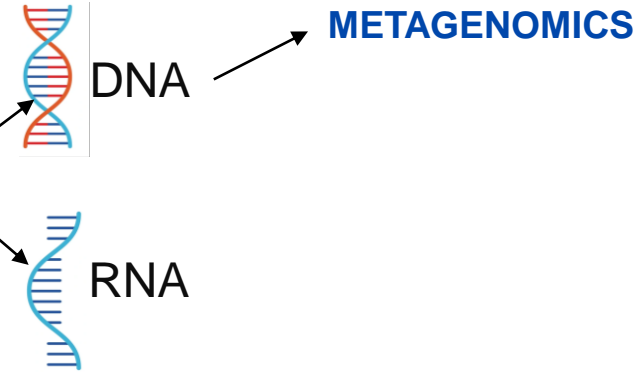
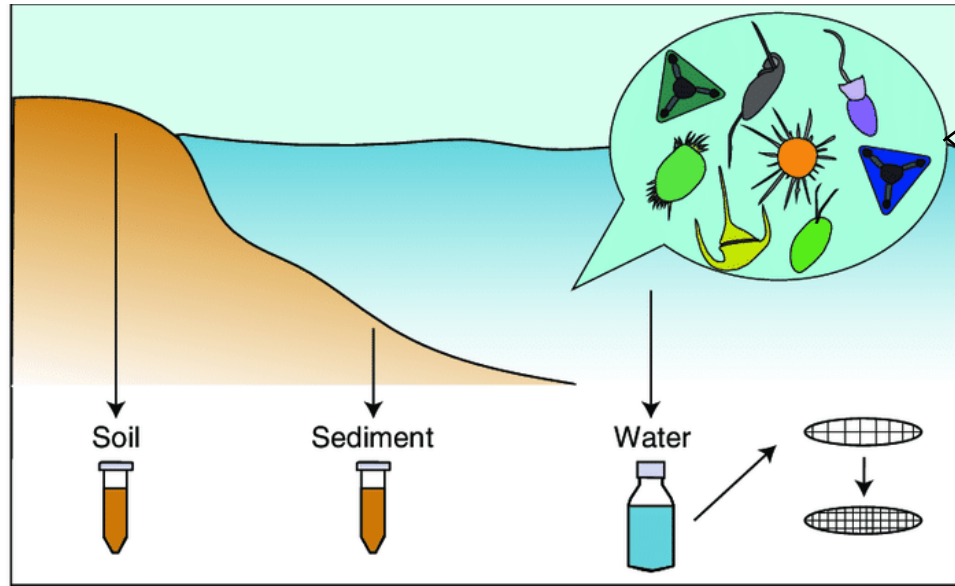
What is metatranscriptomics and why does it matter?

## There are different approaches to study microbial communities



Adapted from: Burki, F., Sandin, M. & Jamy, M. (2021). Diversity and ecology of protists revealed by metabarcoding. *Current Biology*, 31(20), R1233–R1282. <https://doi.org/10.1016/j.cub.2021.07.066>

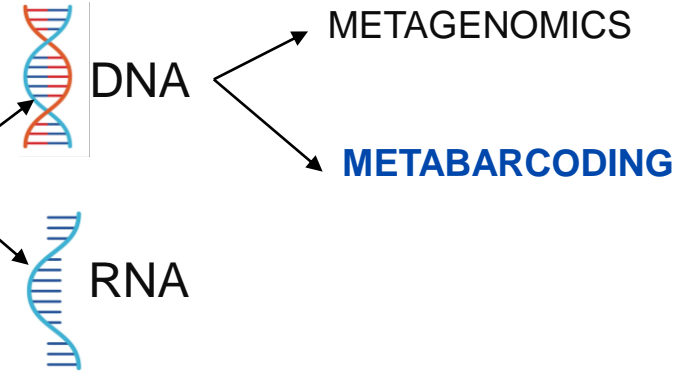
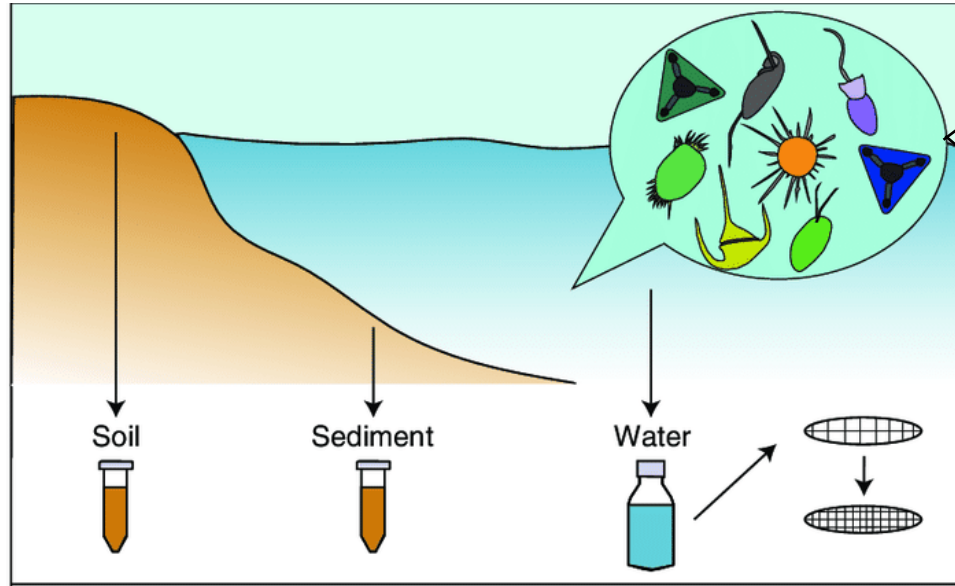
## Metagenomics: What genes are present?



- Sequencing **total community DNA**
- Can reconstruct **genomes**, find **genes** and **functions**

Adapted from: Burki, F., Sandin, M. & Jamy, M. (2021). Diversity and ecology of protists revealed by metabarcoding. *Current Biology*, 31(20), R1233–R1282. <https://doi.org/10.1016/j.cub.2021.07.066>

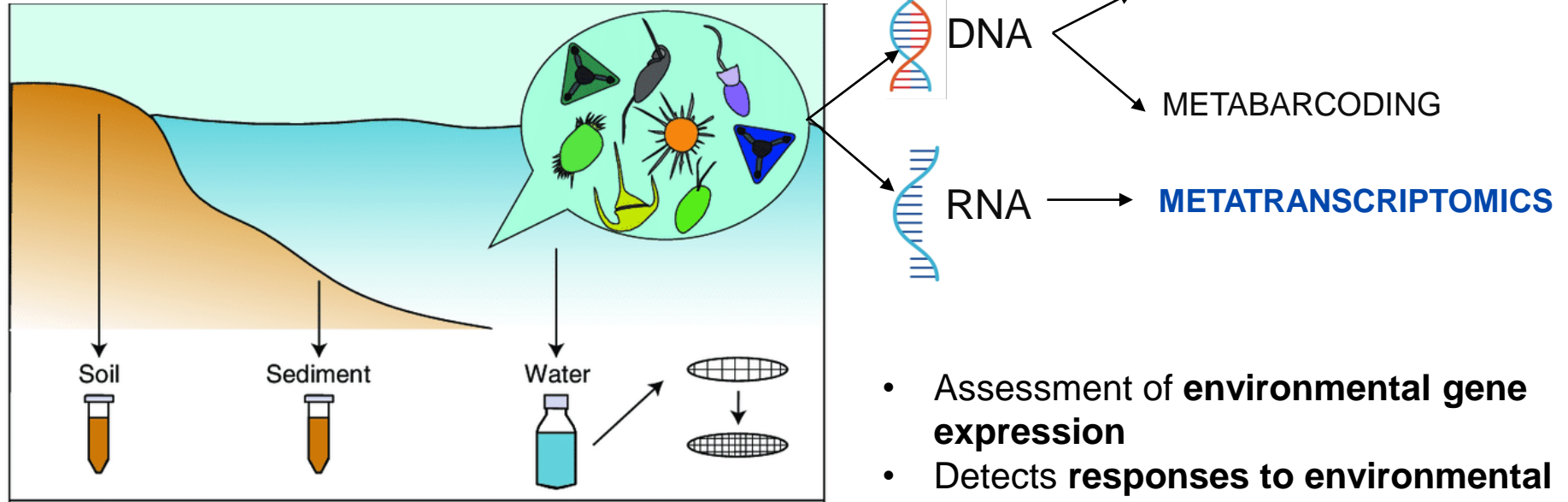
## Metabarcoding: Who is there?



- Targets a **single genetic marker** (e.g., 16S for bacteria, 18S for eukaryotes)
- Good for building **community composition**

Adapted from: Burki, F., Sandin, M. & Jamy, M. (2021). Diversity and ecology of protists revealed by metabarcoding. *Current Biology*, 31(20), R1233–R1282. <https://doi.org/10.1016/j.cub.2021.07.066>

## Metatranscriptomics: What genes are active right now?



Adapted from: Burki, F., Sandin, M. & Jamy, M. (2021). Diversity and ecology of protists revealed by metabarcoding. *Current Biology*, 31(20), R1233–R1282. <https://doi.org/10.1016/j.cub.2021.07.066>

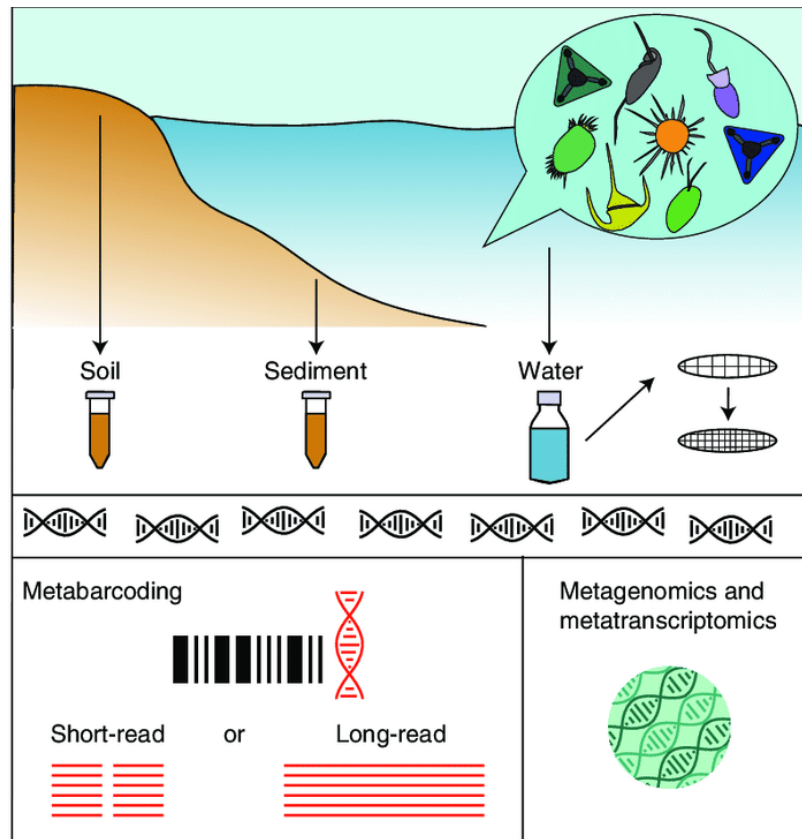
- Assessment of **environmental gene expression**
- Detects **responses to environmental change** (stress, nutrients, pollution)

## Metatranscriptomics: Why does it matter?

Identifies which genes are **actively being expressed** by community members, providing insights into functional activity rather than mere taxonomic presence.

Helps understand:

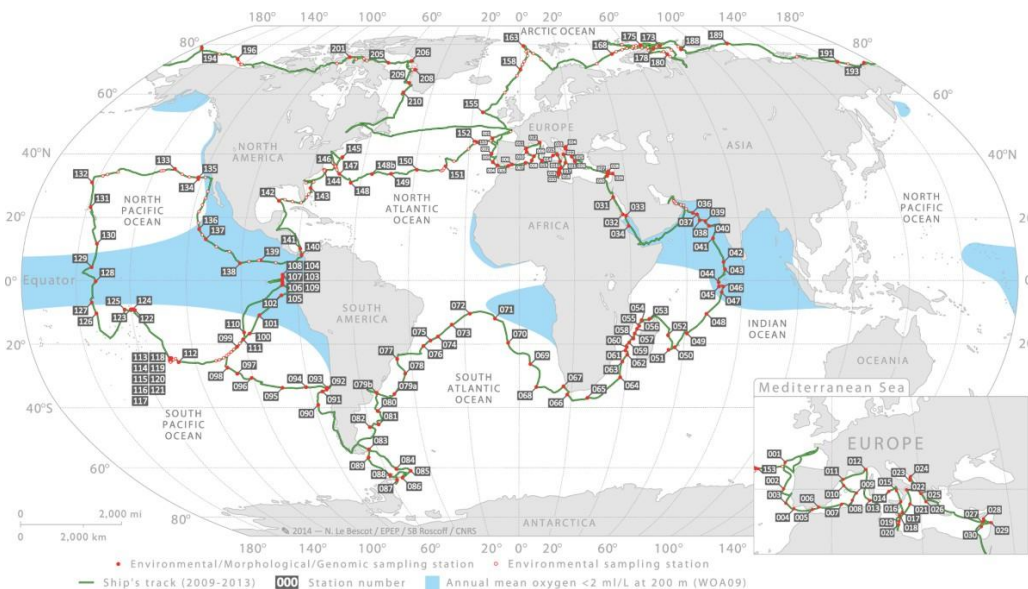
- Ecosystem function
- Microbial behaviour: p.e. human microbiome studies



Adapted from: Burki, F., Sandin, M. & Jamy, M. (2021). Diversity and ecology of protists revealed by metabarcoding. *Current Biology*, 31(20), R1233–R1282. <https://doi.org/10.1016/j.cub.2021.07.066>

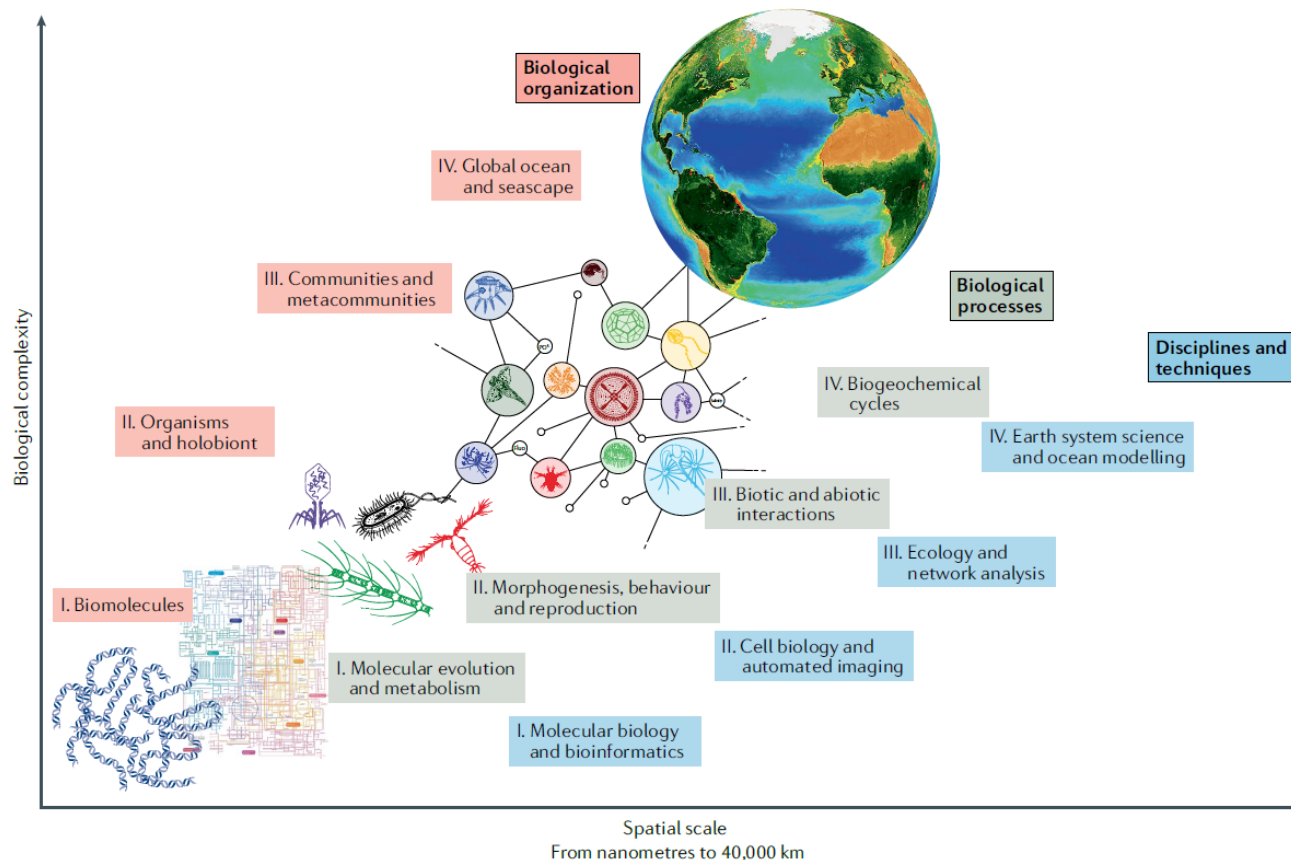


## Practical example: TARA Oceans & marine metatranscriptomics



- International scientific expedition (2009–2013)
- Sampled ocean water from over 200 global stations
- 40,000 marine samples were collected
- **Goal:** Understand the diversity, function, and structure of planktonic life

# Basic concepts of metatranscriptomics



## Challenges and limitations: Ribosomal RNA

More than 95% of RNA is **rRNA** → Difficult mRNA isolation → Wastes sequencing effort

EXPERIMENTAL	<div>Eukaryotes</div> <p>polyA enrichment</p>	<div>Prokaryotes</div> <p>mRNA enrichment strategies</p> <ul style="list-style-type: none"><li>➤ rRNA hybridization/capture</li><li>➤ 5'-3' exonuclease digestion of processed RNAs</li><li>➤ PolyA tail addition via polyA polymerase (E.coli)</li><li>➤ Antibody capture of mRNAs</li></ul>
	<div>Computational filtering</div>	<div>Computational filtering</div>

## Challenges and limitations:

### RNA stability

RNA degrades rapidly, requiring careful sample handling.



### Host contamination

In host-associated samples (p.e. gut) a large fraction of RNA comes from the host. Can be difficult to separate in complex samples.

## Challenges and limitations: Data complexity

- **Mapping reads:** difficult due to the lack of reference genomes
- **Ambiguous reads:** Many genes are conserved across species, paralogous genes contain high sequence similarity
- **Normalization:** Transcript abundance is influenced by both gene expression and organism abundance (+ technical artifacts)

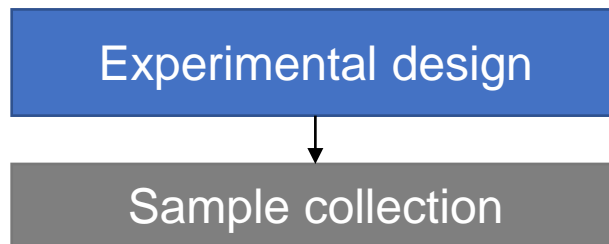
- 1 Basic concepts of metatranscriptomics
- 2 **Experimental design**
- 3 Downstream analysis

## Section 2.1.

# Experimental design

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Sampling and RNA extraction



- What type of sample will I collect?
- Does the time or condition of collection matter?
- How can I avoid contamination?
- How much material is needed?



## Environmental samples



Sediment

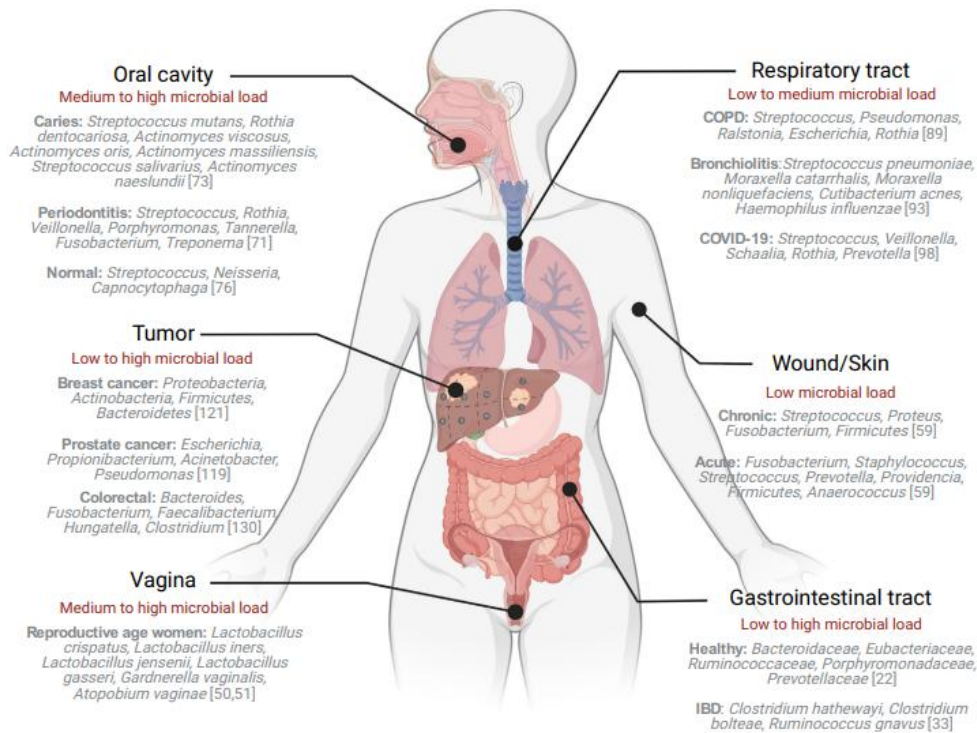


Soil



Water

## Host-associated biological samples



Ojala, T., Kankuri, E., & Kankainen, M. (2023). Understanding human health through metatranscriptomics. *Trends in Molecular Medicine*, 29(5), 376–389. <https://doi.org/10.1016/j.molmed.2023.02.002>

## Select the study area for sampling

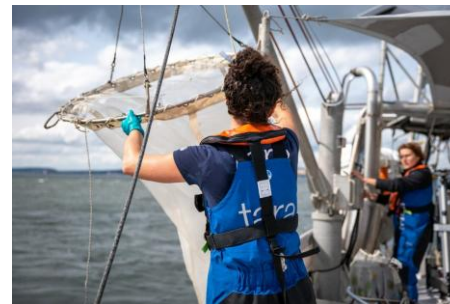
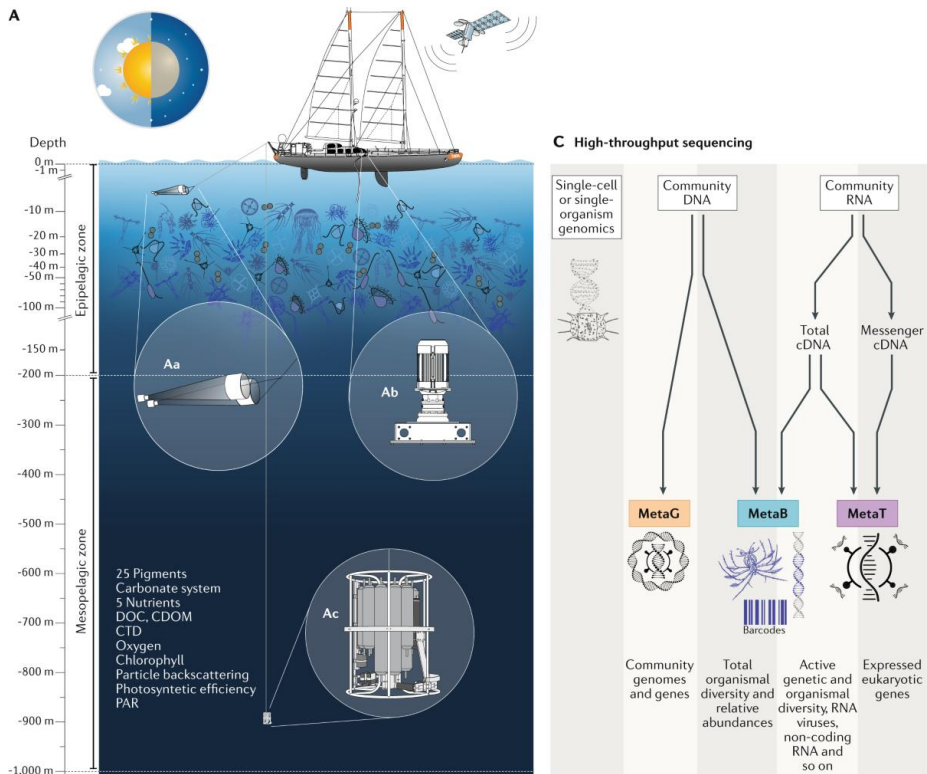
- 1- In-depth study of the **maps and satellite data** to identify the schooner's precise station.
- 2- Certain regions are chosen on the basis of observable **phenomena**, such as phytoplankton blooms.
- 3- Choose **appropriate tool** for the type of sampling required.

## Practical example: TARA Oceans & marine metatranscriptomics



[https://www.encyclopedie-environnement.org/app/uploads/2021/02/Tara-Expedition\\_fig3-trajet-schema.jpg](https://www.encyclopedie-environnement.org/app/uploads/2021/02/Tara-Expedition_fig3-trajet-schema.jpg)

## Practical example: TARA Oceans & marine metatranscriptomics



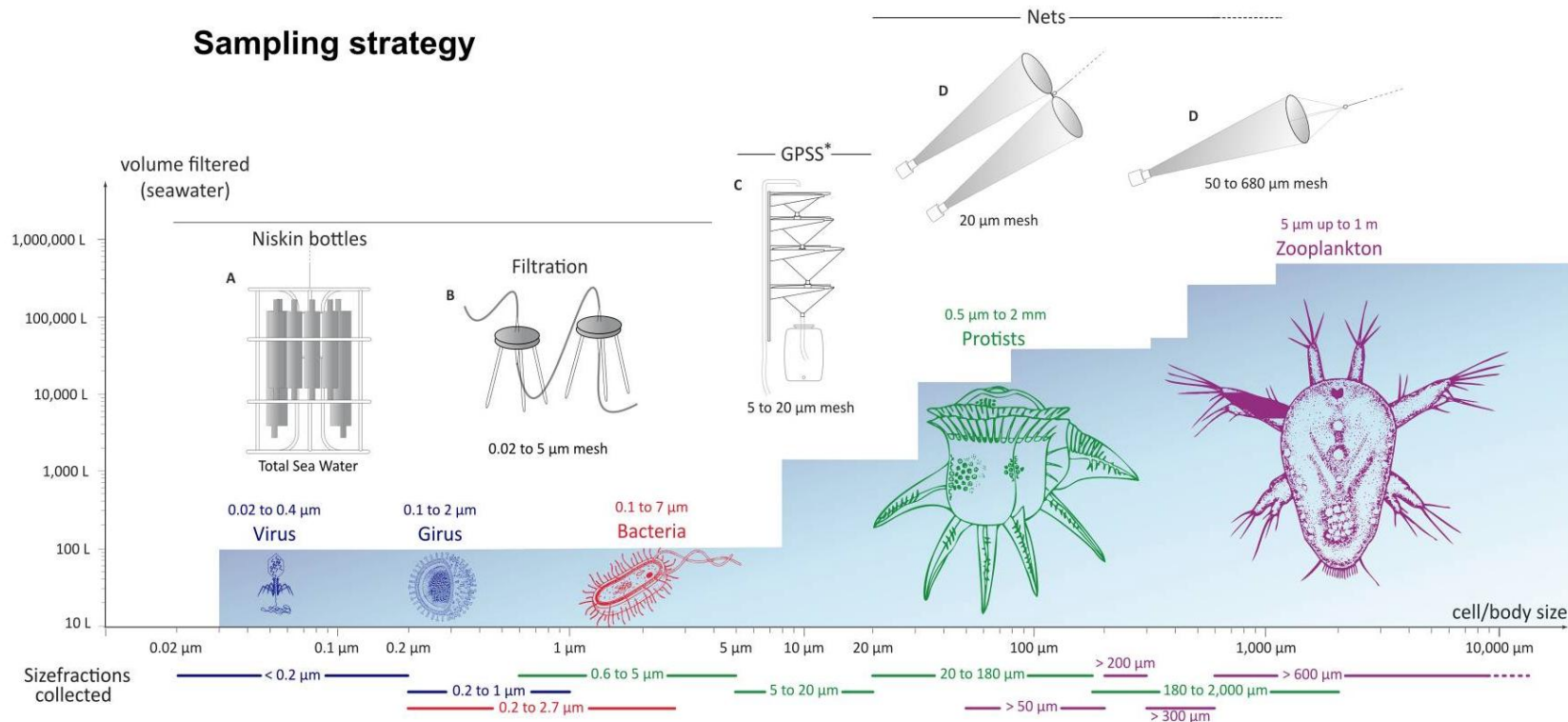
Bringing the Regent net back on board – © Maeva Bardy, Tara Ocean Foundation



Net sampling on board Tara – © Louise Cognard, Tara Ocean Foundation

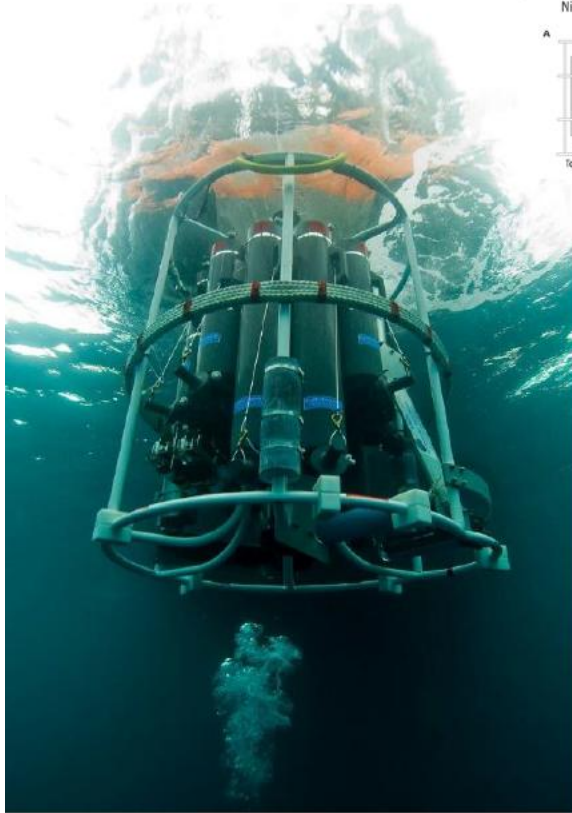


## Sampling strategy



Karsenti, E., Acinas, S. G., Bork, P., Bowler, C., De Vargas, C., Raes, J., Sullivan, M., Arendt, D., Benzoni, F., Claverie, J., Follows, M., Gorsky, G., Hingamp, P., Iudicone, D., Jaillon, O., Kandels-Lewis, S., Krzic, U., Not, F., Ogata, H., . . . Wincker, P. (2011). A holistic approach to Marine Eco-Systems Biology. *PLoS Biology*, 9(10), e1001177. <https://doi.org/10.1371/journal.pbio.1001177>

# Experimental design: Sample collection

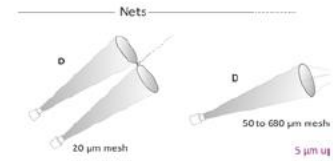


**Niskin bottles** <1 $\mu$ m



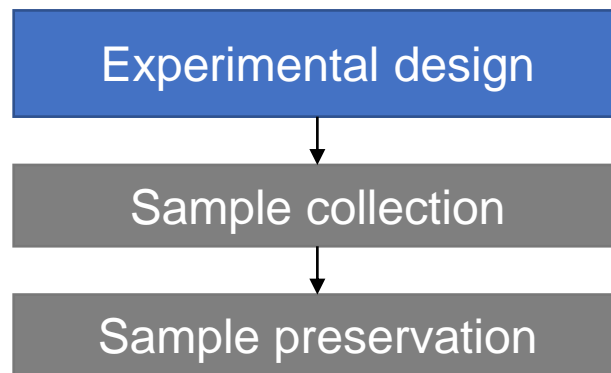
**GPSS**

« Gravity Plankton Sieving System »  
0.8-5 $\mu$ m ; 5-20 $\mu$ m



**Nets**

20-180 $\mu$ m ; >180 $\mu$ m



- What type of sample will I collect?
- Does the time or condition of collection matter?
- How can I avoid contamination
- How much material is needed?

- How will I stabilize RNA after collection?



## Preservation methods to maintain RNA integrity

### Stabilize against RNA degradation:

- mRNA has a short half-life (minutes)
- Endogenous RNases

### Stabilize gene expression profiles :

- Transport and handling can alter them

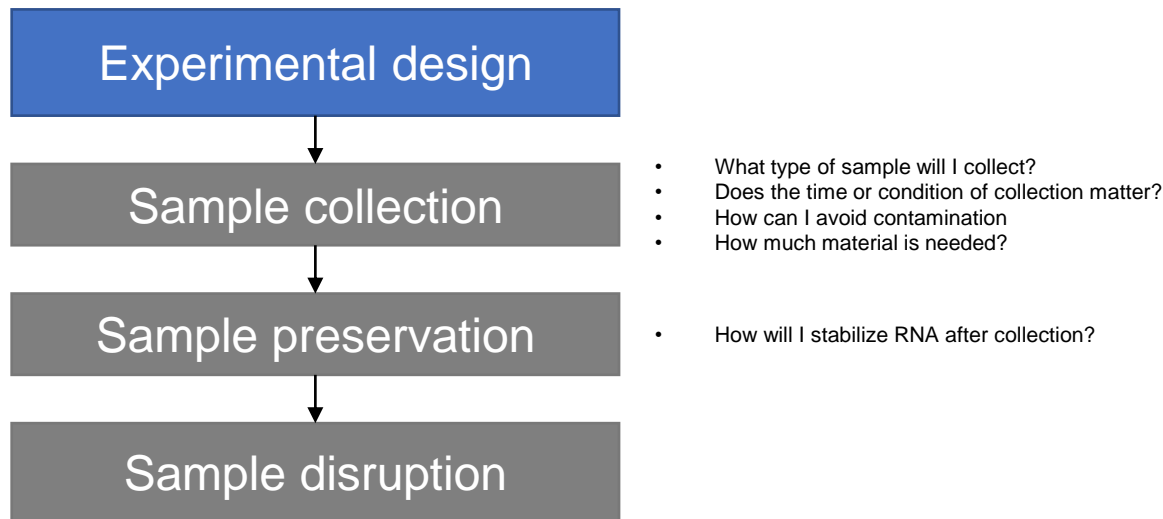
- Flash freezing
- RNAlater®
- RNAprotect®
- Phenol-Ethanol
- TRIzol®, QIAzol®, TRI®



Transferring samples to liquid nitrogen – © Leslie Moquin, Tara Ocean Foundation



Flash freezing -> Filters stored at -80°C -> dry ice for shipping



- Is my priority RNA yield (qualitative) or reproducibility (quantitative)?

## Main methods:

Mechanical disruption (bead beater)  
Enzymatic lysis (lysozyme or lysostaphin)  
Proteinase K digestion

## Recommendations:

- For **qualitative studies**: Combine all lysis methods to maximize RNA recovery.



As much diversity as possible

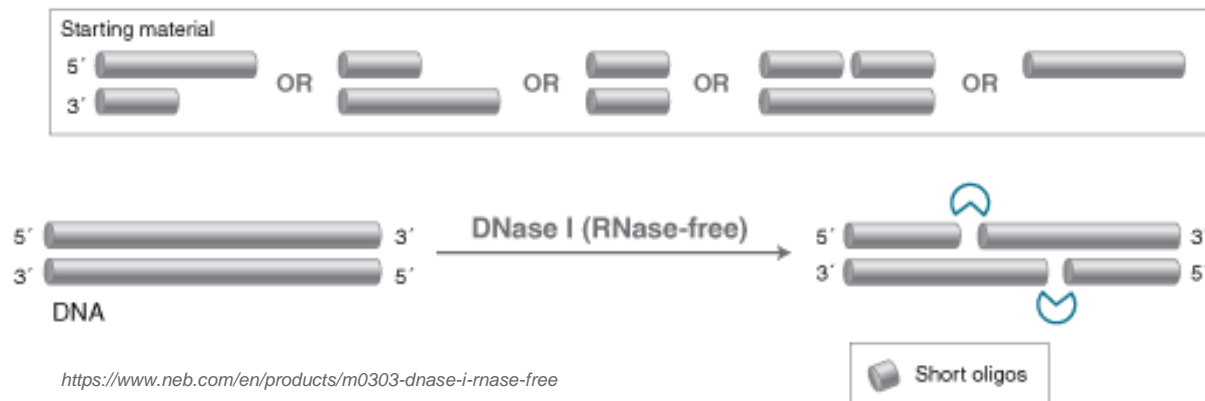
- For **quantitative studies**: Prefer mechanical methods, that are more reproducible.



Reproducibility

During cell lysis, both DNA and RNA are released simultaneously. Therefore, to obtain high-quality RNA, it is essential to use specific enzymes—such as DNase I—to remove any residual DNA from the sample.

DNase I can degrade double-stranded and single-stranded DNA.



## MICROBIAL GENOMICS

## RESEARCH ARTICLE

Barber *et al.*, *Microbial Genomics* 2024;10:001298

DOI 10.1099/mgen.0.001298



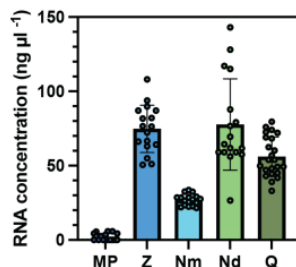
## Evaluation of commercial RNA extraction kits for long-read metatranscriptomics in soil

Daniel G. Barber<sup>1</sup>, Christian A. Davies<sup>2</sup>, Iain P. Hartley<sup>1</sup> and Richard K. Tennant<sup>1,\*</sup>

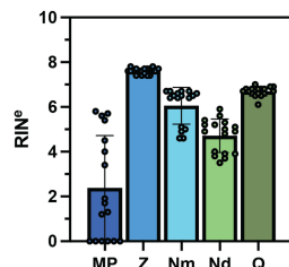
Extraction kit	Product code	Acronym used in this study	Input wt (g)	Homogenisation speed (m s <sup>-1</sup> )	Homogenisation time (seconds)	Elution vol. (μl)
FastRNA Pro Soil-Direct Kit (MP Biomedicals)	6070050	MP	~0.5	6	40	100
Quick-RNA Faecal/Soil Microbe Microprep kit (Zymogen Research)	R2040	Z	~0.25	6	40	10–15
NucleoBond RNA Soil Mini kit for RNA from soil (Machery-Nagel)	740 142.50	Nm	~0.5	6	40	100
NucleoBond RNA Soil Midi kit for RNA from soil (Machery-Nagel)	740 140.20	Nd	~2	6	40	100
RNeasy PowerSoil Total RNA kit (Qiagen)	12866–25	Q	~2	6	40	100

Extraction kit	Acronym used in this study	Sufficient yield	RNA integrity	Purity	Extraction handling & process
FastRNA Pro Soil-Direct Kit (MP Biomedicals)	MP	—	—	—	—
Quick-RNA Faecal/Soil Microbe Microprep kit (Zymogen Research)	Z	+	++	—	+
NucleoBond RNA Soil Mini kit for RNA from soil (Machery-Nagel)	Nm	+	+	+	+
NucleoBond RNA Soil Midi kit for RNA from soil (Machery-Nagel)	Nd	++	—	+	--
RNeasy PowerSoil Total RNA kit (Qiagen)	Q	++	++	+	+

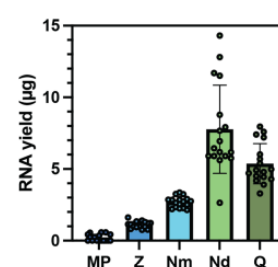
(a) RNA concentration



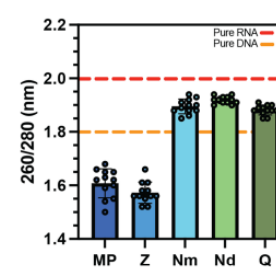
(b) RNA integrity



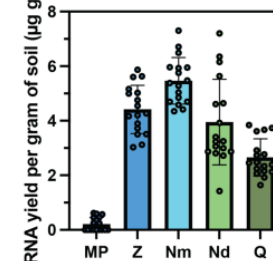
(c) Total RNA



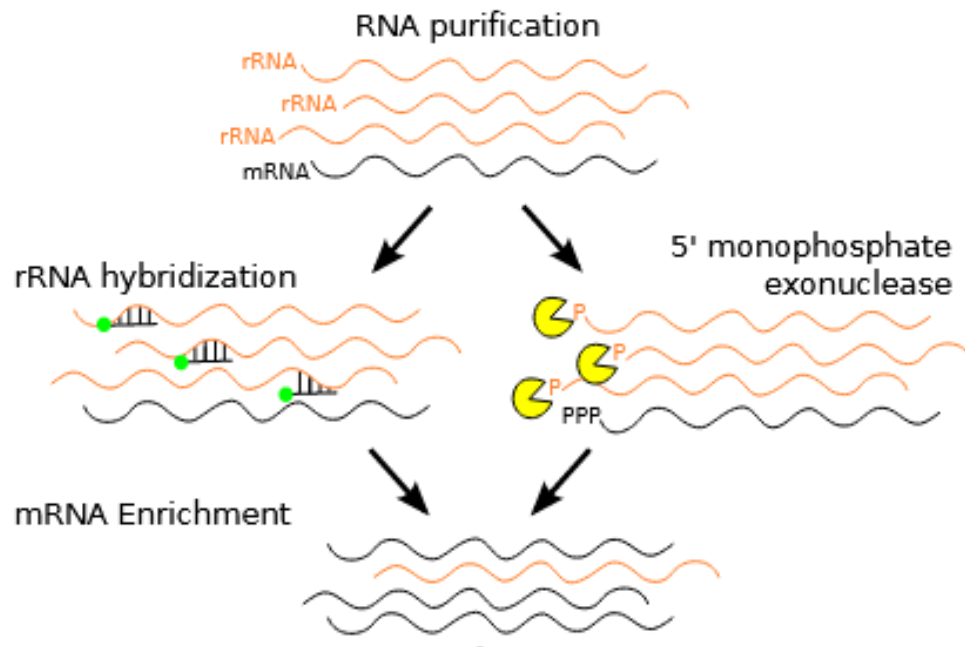
(d) Purity



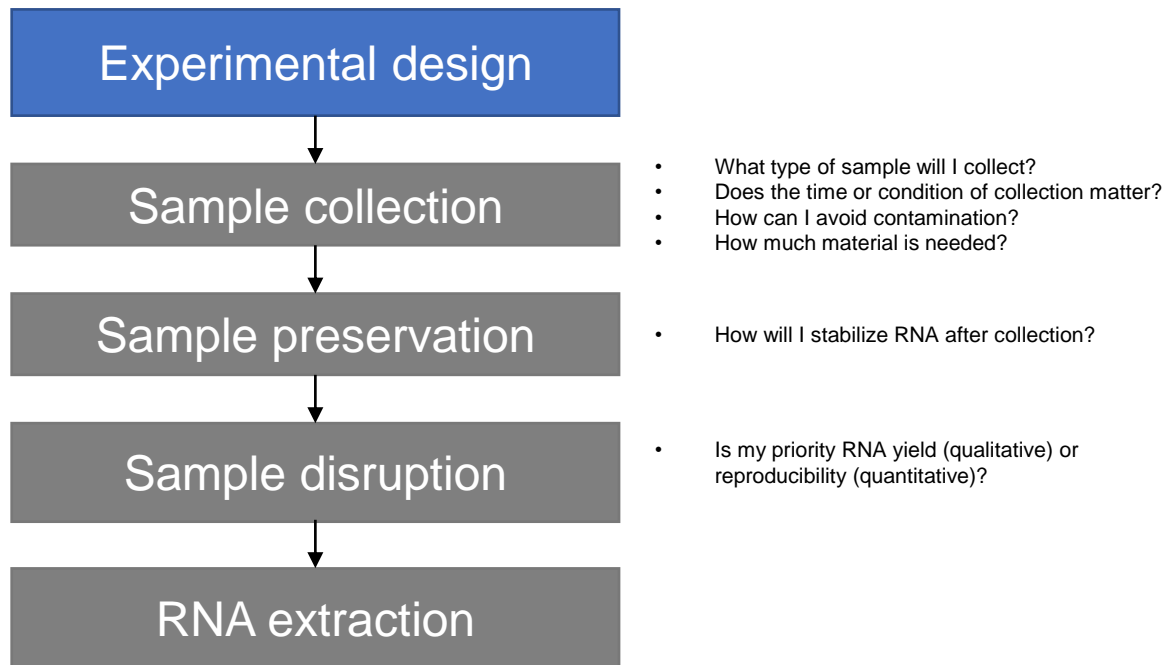
(e) Extraction efficiency



## RNA extraction + rRNA depletion



Adapted from Aransay, A. M., & Trueba, J. L. L. (2016). Field Guidelines for Genetic Experimental Designs in High-Throughput Sequencing. In Springer eBooks. <https://doi.org/10.1007/978-3-319-31350-4>



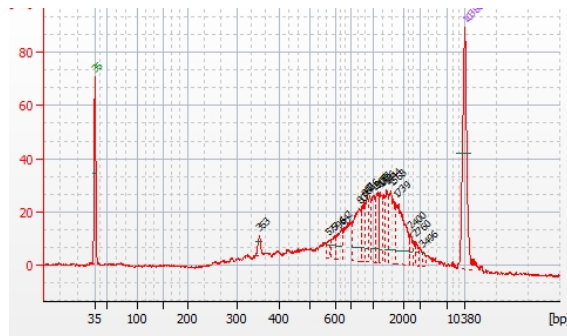
- Should rRNA depletion be performed as part of the RNA extraction process?



## RIN and Fragment size distribution

Methods to check RNA quality:

- Femto Pulse: Ultra-sensitive capillary electrophoresis, ultra low input RNA
- Bioanalyzer: Microfluidic electrophoresis
- TapeStation: Automated capillary electrophoresis, high-throughput



Bioanalyzer

## Section 2.2.

# Experimental design

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Library preparation and RNA-Seq platform selection

**There is no easy answer. Trade-off between:**

- Overall cost      How much money do you have?



**There is no easy answer. Trade-off between:**

- Overall cost
- Read length

What is your desired read length?



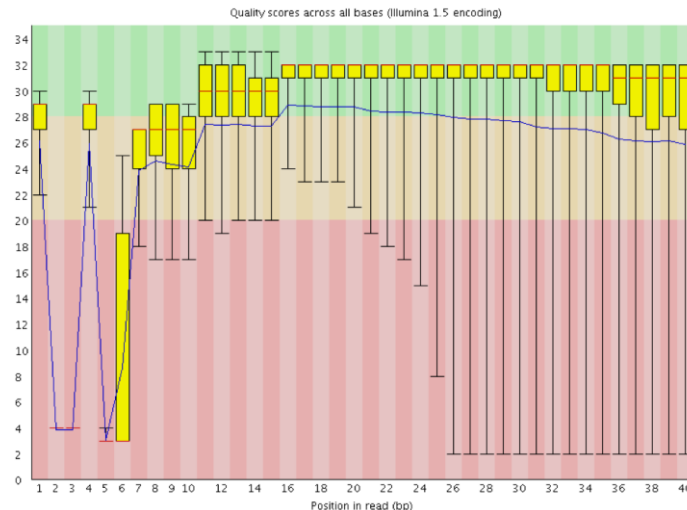
**There is no easy answer. Trade-off between:**

- Overall cost
- Read length
- Sequencing depth

How many reads do you need per sample?

## There is no easy answer. Trade-off between:

- Overall cost
- Read length
- Sequencing depth
- Quality of the data



**There is no easy answer. Trade-off between:**

- Overall cost
- Read length
- Sequencing depth
- Quality of the data
- Support for the available technology

## There is no easy answer. Trade-off between:

- Overall cost
- Read length
- Sequencing depth
- Quality of the data
- Support for the available technology

Consider also the mix of two strategies (p.e. ONT and Illumina)



## Section 2.3.

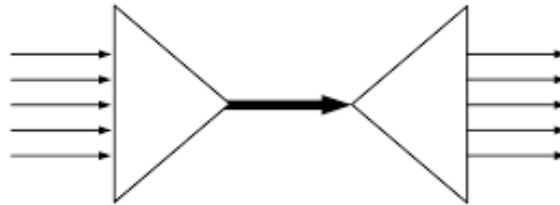
# Experimental design

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RNA quantity and multiplexing

Platform	RNA Input	Notes
Illumina	1-1000ng (Illumina Stranded Total RNA Prep)	Can work with low input, Illumina Total RNA Prep with Ribo-Zero Plus
ONT (Nanopore)	300 ng polyA (direct RNA) 1 µg total RNA (direct RNA) 10 ng polyA (cDNA) 500 ng total RNA (cDNA)	Direct RNA requires more input; cDNA kits are more flexible
PacBio	300ng	Less suitable for low-input samples

Sequencing adapters can include a **barcode** that serves to identify the sample if several samples are mixed in the same run (multiplexing).



## Challenges

### **Short-reads:**

- Fragmented reads
- Difficult transcript assembly specially for diverse microbial communities

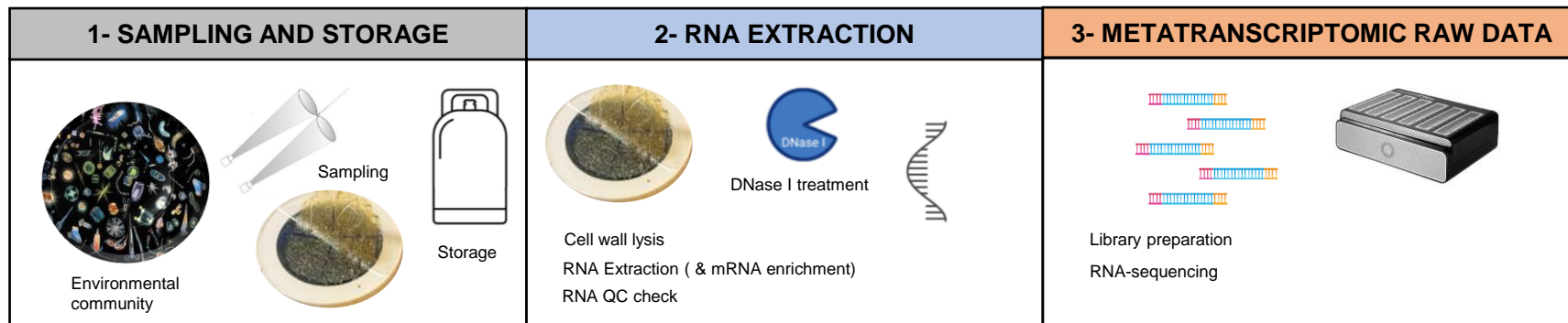
### **Long-reads:**

- Higher cost, limiting the scale of the experiments
- Sequencing errors are particularly problematic for metatranscriptomic samples
- Lower sequencing depth

While long-read sequencing platforms generally offer lower sequencing depth compared to short-read platforms, they allow the **direct capture of full-length transcripts**, including those from **low-abundance genes or rare microorganisms**.

In contrast, short-read data requires **assembly or transcript inference**, which often leads to the **loss of rare** - especially problematic in **metatranscriptomics**, where transcriptomes are highly complex.

Therefore, even with fewer reads, **long reads can more faithfully represent transcript diversity**.



What are the main advantages of long-read sequencing over short-read sequencing in metatranscriptomics?

In metatranscriptomic studies, what is the key difference between qualitative and quantitative experiments?

Why do you think that sequencing depth is particularly important in metatranscriptomics compared to single-organism transcriptomics?

1 Basic concepts of metatranscriptomics

2 Experimental design

3 **Downstream analysis**

4



## Section 3.1.

# Downstream analysis

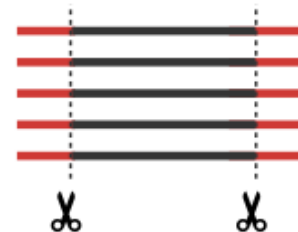
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Quality control of raw reads

## Trimming

Reads can contain adapter sequences, primers, barcodes.

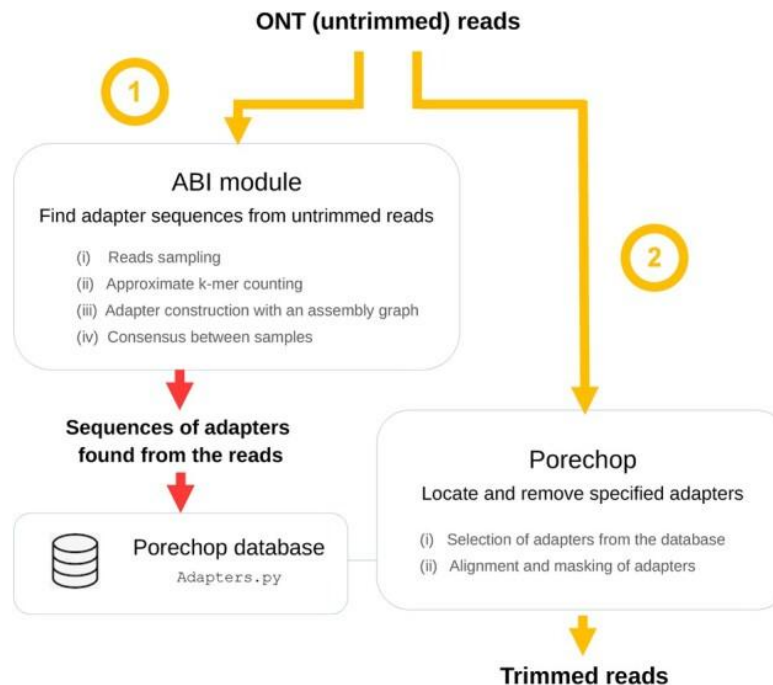
Trimming help to retain **high-confidence sequences** that will map more accurately and uniquely to references.



## Trimming

### Tools:

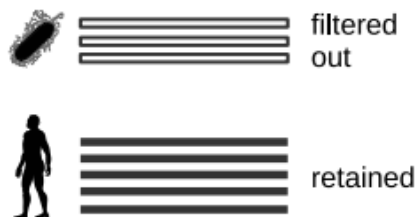
- Porechop (**outdated**)
- Pychopper
- Porechop-abi
- Dorado trim



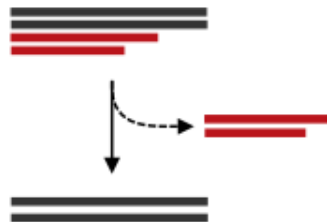
Bonenfant, Q., Noé, L., & Touzet, H. (2022). Porechop\_ABI: discovering unknown adapters in Oxford Nanopore Technology sequencing reads for downstream trimming. *Bioinformatics Advances*, 3(1). <https://doi.org/10.1093/bioadv/vbac085>

## Additional filtering

- Host contamination



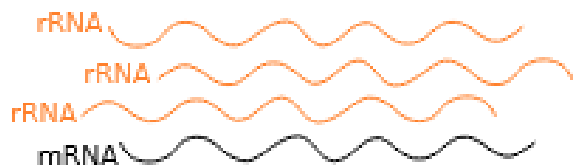
- Reads within a length range



- Others: Mask low complexity regions, remove low quality reads

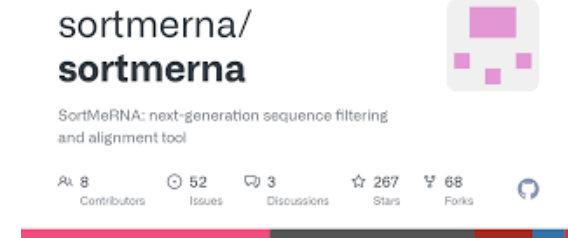
## Removal of rRNA reads computationally

- If we sequence total RNA, most RNA sequences will be ribosomal RNA (rRNA)
- Its important to filter out rRNA before downstream analysis



### SortMeRNA: Removal of rRNA reads computationally

- SortMeRNA takes as input files of reads and one or multiple rRNA database file, and sorts apart aligned and rejected reads into two files.
- Can sort a large set of metatranscriptomic reads with high accuracy
- Algorithm implements seeds with errors -> robust to errors of different types of sequencers
- Database can be constructed on any family of sequences provided by the user.




### SortMeRNA: Removal of rRNA reads computationally

- Database can be constructed on any family of sequences provided by the user.

#### JOURNAL ARTICLE

#### The Protist Ribosomal Reference database (PR<sup>2</sup>): a catalog of unicellular eukaryote Small Sub-Unit rRNA sequences with curated taxonomy

Laure Guillou  , Dipankar Bachar , Stéphane Audic , David Bass ,  
Cédric Berney , Lucie Bittner , Christophe Boutte , Gaétan Burgaud ,  
Colomban de Vargas , Johan Decelle ... [Show more](#)

sortmerna/  
sortmerna



SortMeRNA: next-generation sequence filtering  
and alignment tool

8 Contributors 52 Issues 3 Discussions 267 Stars 68 Forks 

## Section 3.2.

# Downstream analysis

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Transcript assembly



## Short reads- **De Novo Assembly**

- Velvet
- SOAPdenovo
- Trinity
- Oases



+ **Cluster** overall results (p.e. cd-hit-est)

### Long reads- (Not always) De Novo Assembly

Long-read reduce or eliminate the need for de novo assembly

Using raw long reads helps retain a more **faithful representation of the biological sample**, avoiding biases introduced during transcript assembly.

Particularly powerful in complex microbial communities, where assembly can be difficult due to **high diversity and redundancy**.

## Section 3.3.

# Downstream analysis

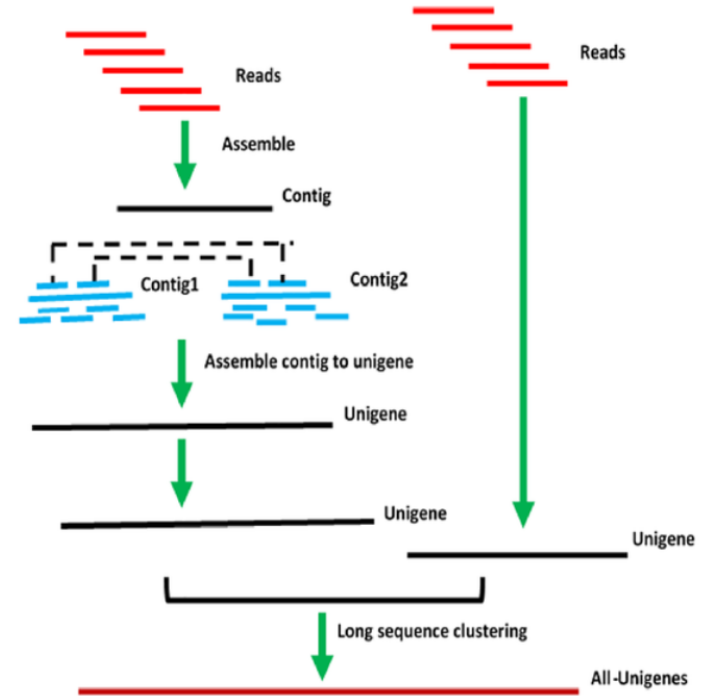
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Reference sequences for mapping

## Mapping on transcripts/proteins catalogs: Unigenes

Non-redundant sets of gene sequences clustered together based on shared sequence similarity

- Functions
- Taxonomy
- Abundance
- Expression



Rasool, K. G., Mehmood, K., Husain, M., Tufail, M., Alwaneen, W. S., & Aldawood, A. S. (2021).


## Mapping on transcripts/proteins catalogs: Unigenes

ARTICLE

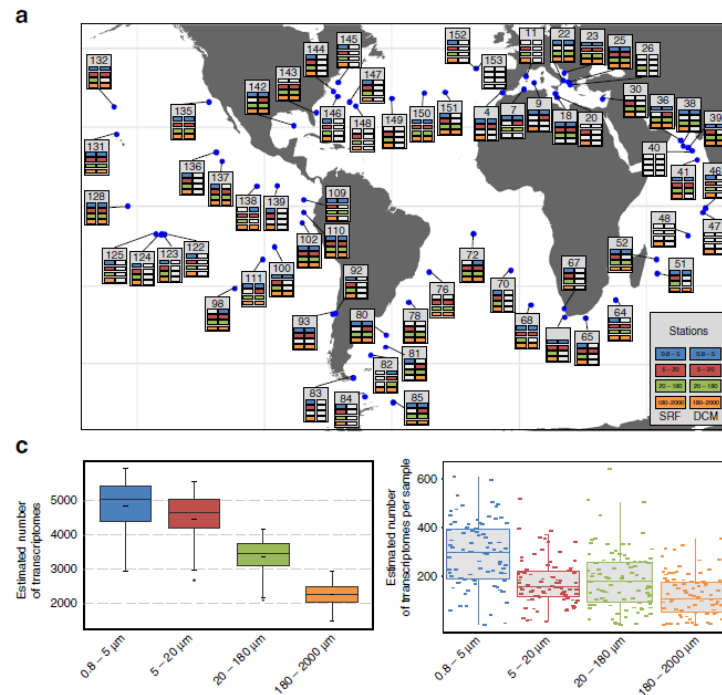
DOI: 10.1038/s41467-017-02342-1

OPEN

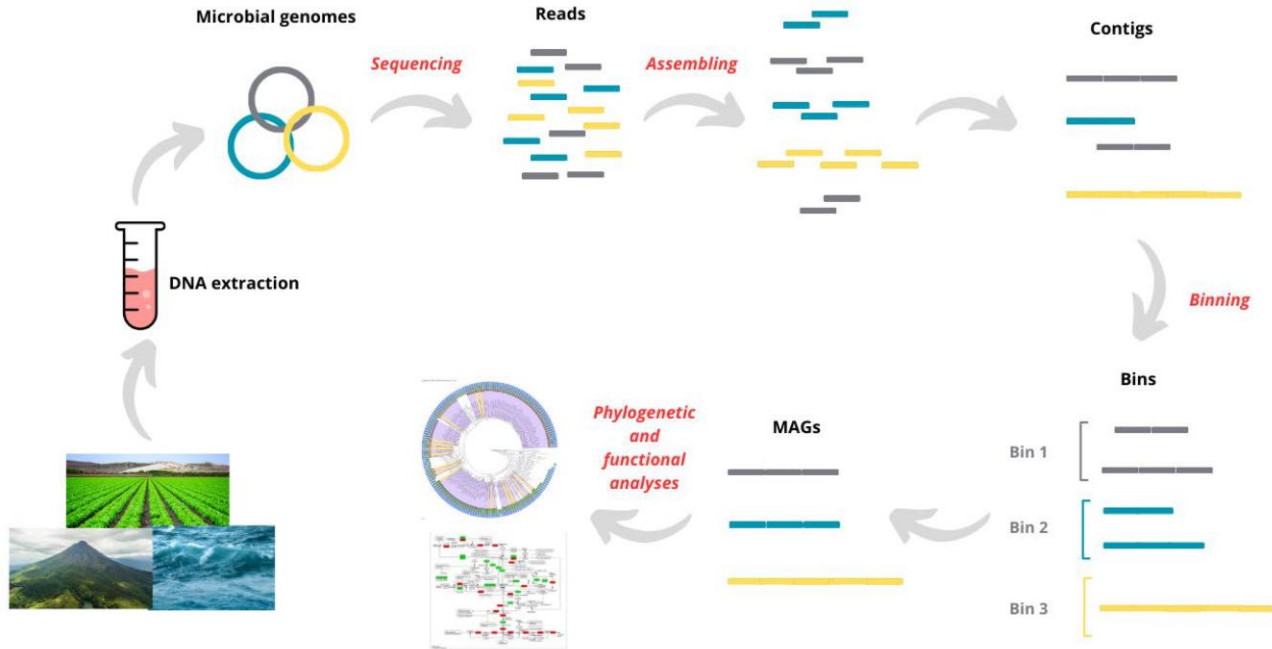
### A global ocean atlas of eukaryotic genes

Quentin Carradec et al. 

The individual sequence reads cluster into **116 million unigenes** representing the largest reference collection of eukaryotic transcripts from any single biome.



## Mapping on « genomes » like Metagenome-Assembled Genomes (MAGs)



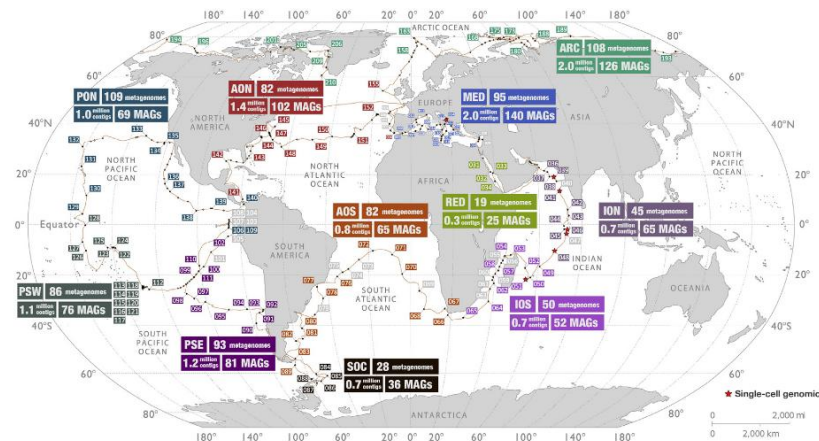
Mirete, S., Sánchez-Costa, M., Díaz-Rullo, J., De Figueras, C. G., Martínez-Rodríguez, P., & González-Pastor, J. E. (2025). Metagenome-Assembled Genomes (MAGs): advances, challenges, and ecological insights. *Microorganisms*, 13(5)

## Mapping on « genomes »

### Article

### Functional repertoire convergence of distantly related eukaryotic plankton lineages abundant in the sunlit ocean

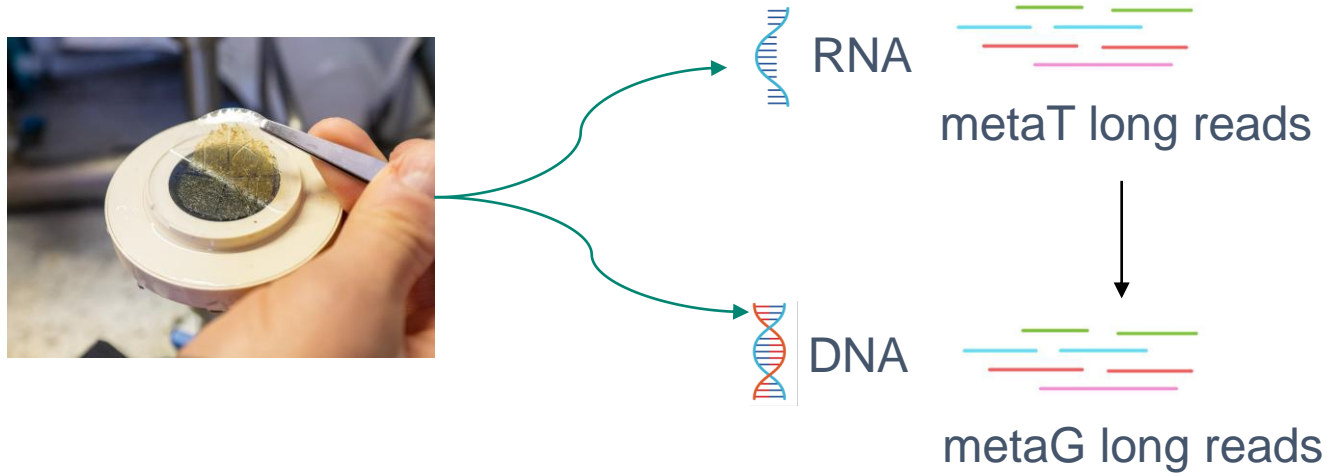
Tom O. Delmont,<sup>1,2,9,\*</sup> Morgan Gaia,<sup>1,2</sup> Damien D. Hinsinger,<sup>1,2</sup> Paul Frémont,<sup>1,2</sup> Chiara Vanni,<sup>3</sup> Antonio Fernandez-Guerra,<sup>4</sup> A. Murat Eren,<sup>5</sup> Artem Kourlaiev,<sup>1,2</sup> Leo d'Agata,<sup>1,2</sup> Quentin Clayssen,<sup>1,2</sup> Emilie Villar,<sup>1</sup> Karine Labadie,<sup>1,2</sup> Corinne Cruaud,<sup>1,2</sup> Julie Poulain,<sup>1,2</sup> Corinne Da Silva,<sup>1,2</sup> Marc Wessner,<sup>1,2</sup> Benjamin Noel,<sup>1,2</sup> Jean-Marc Aury,<sup>1,2</sup> Tara Oceans Coordinators, Colombar de Vargas,<sup>2,6</sup> Chris Bowler,<sup>2,7</sup> Eric Karsenti,<sup>2,6,8</sup> Eric Pelletier,<sup>1,4</sup> Patrick Wincker,<sup>1,2</sup> and Olivier Jaillon<sup>1,2</sup>



683 new eukaryotic genomes of at least 10 Mb in size.

The averaged statistics of the whole dataset were **35.4 Mb in genome size**, about **14,000 genes per MAG**, and a **BUSCO completeness of 40%**.

### Mapping on metagenomic long reads from the same sample



Metatranscriptomics provides a window into the active fraction of **uncultivable microorganisms**



## Section 3.4.

# Downstream analysis

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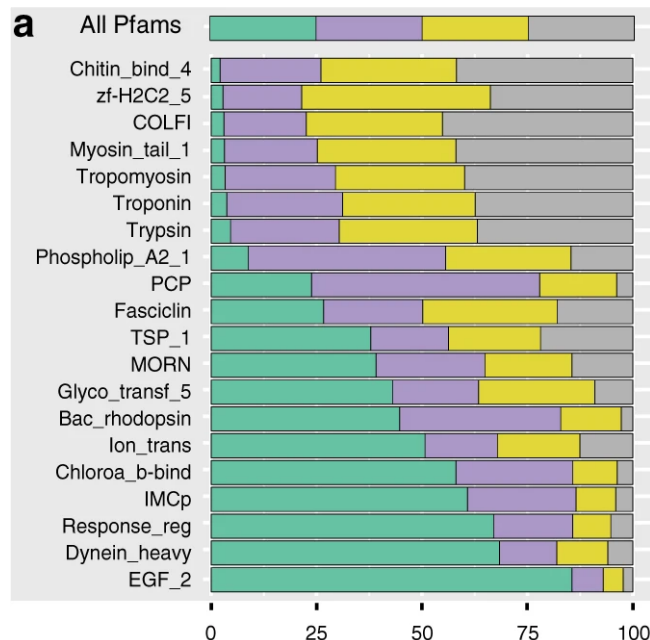
Taxonomic and functional characterization



## Functional Analysis

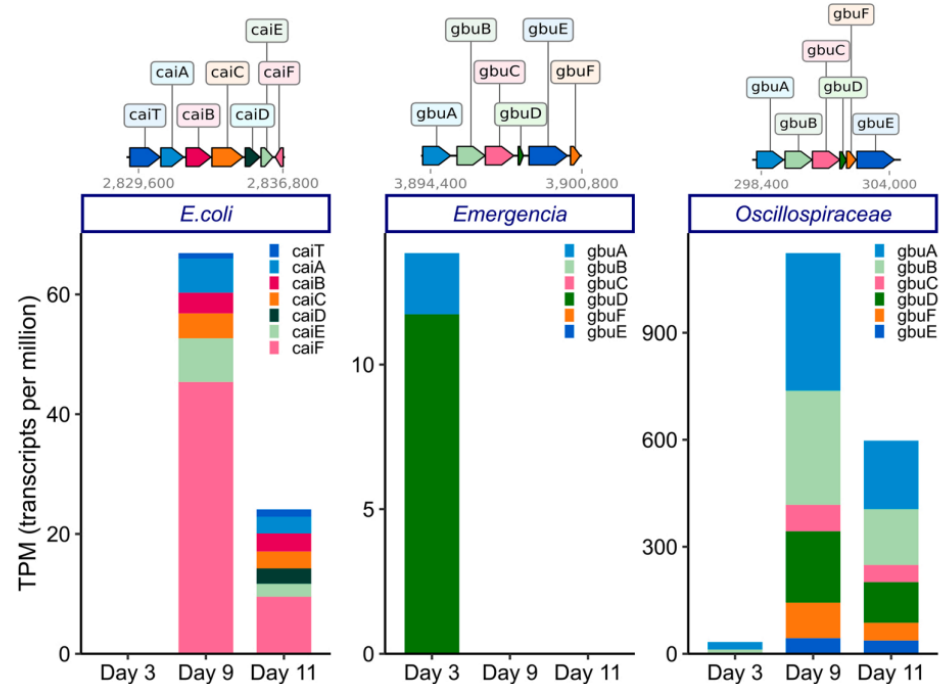
Identify the **biological functions** of expressed genes (mRNAs) in the microbial community.

- HUMAnN3
- MEGAN
- DIAMOND
- eggNOG-mapper
- Pfam + HMMER

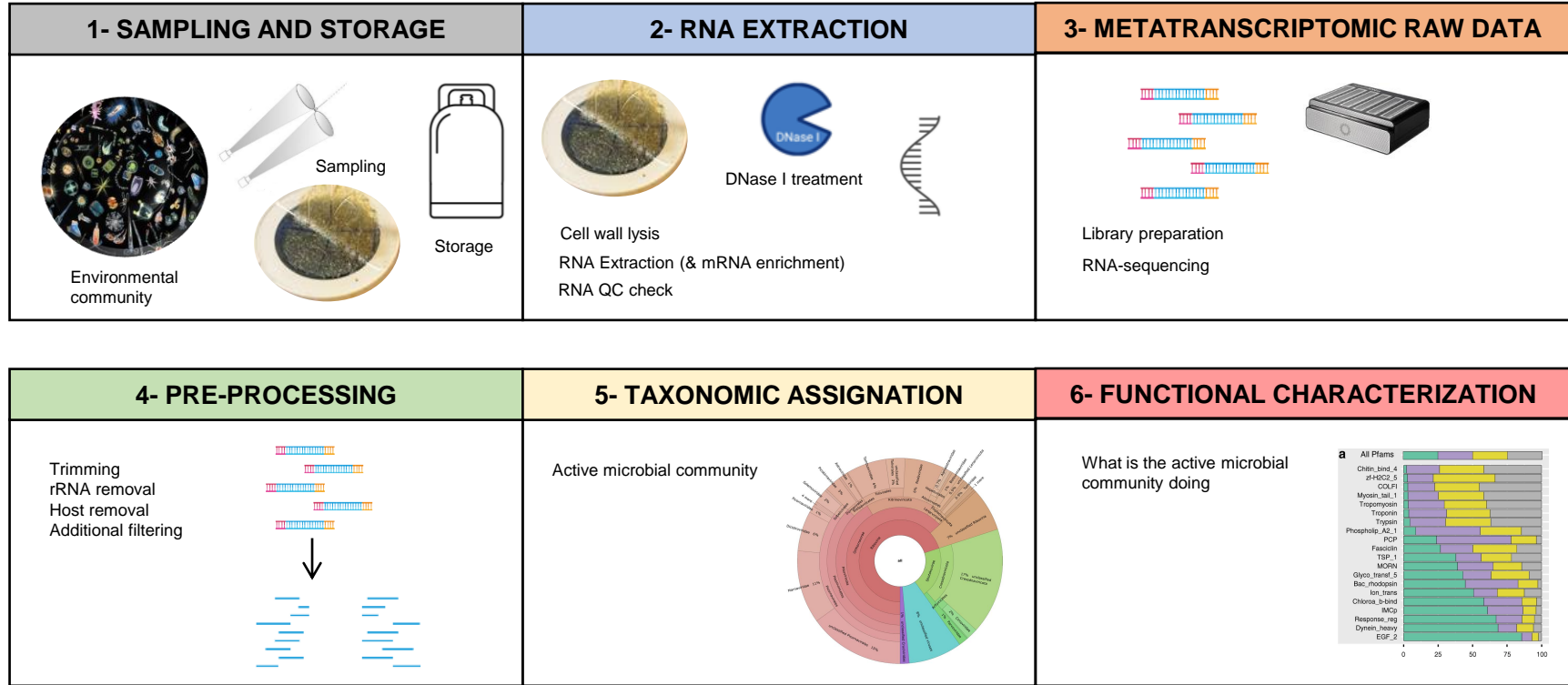


## Interpreting metatranscriptomic variation

- Alterations in the relative abundance of organisms and their associated genes
- Changes in the expression of genes encoded among the community members



Simó, C., Mamani-Huanca, M., Hernández-Hernández, O., Redondo-Río, Á., Muñoz, S., & García-Cañas, V. (2025).



## Tara Oceans revealed hidden marine diversity

The large quantity of genetic barcodes generated made it possible first of all to characterize almost all the eukaryotic species of plankton in the photic zone analysed. **150,000 genetic types of eukaryotic plankton** were identified, which represents an unsuspected diversity compared to the 11,000 species described so far. It appeared that the vast majority of the genetic types listed have no close reference in current genetic databases, demonstrating that these organisms are mostly **unrecorded and uncultivable**. One third of the genetic diversity could not be associated with any of the major eukaryotic lines recognized today.

*<https://www.encyclopedie-environnement.org/en/life/the-tara-oceans-expedition-explores-the-diversity-of-plankton/>*

## Tara Oceans revealed hidden marine diversity

ARTICLE

DOI: [10.1038/s41467-017-02342-1](https://doi.org/10.1038/s41467-017-02342-1)

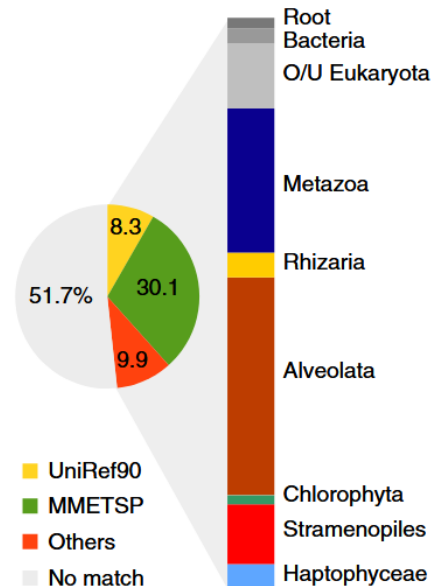
OPEN

### A global ocean atlas of eukaryotic genes

Quentin Carradec et al.<sup>#</sup>

- 116 million unigenes
- N50 ~ 650bp
- 51.2% of unigenes have no matches in public sequence databases

a



# Thank You!

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For more information about the LongTREC Summer School:

<https://longtrec.eu>





RNA



DNA

## MICROBIAL GENOMICS

### RESEARCH ARTICLE

Barber *et al.*, *Microbial Genomics* 2024;10:001298

DOI 10.1099/mgen.0.001298



## Evaluation of commercial RNA extraction kits for long-read metatranscriptomics in soil

Daniel G. Barber<sup>1</sup>, Christian A. Davies<sup>2</sup>, Iain P. Hartley<sup>1</sup> and Richard K. Tennant<sup>1,\*</sup>

## ACCESS MICROBIOLOGY

an open research platform

### RESEARCH ARTICLE

Child *et al.*, *Access Microbiology* 2024;6:000868.v3

DOI 10.1099/acmi.0.000868.v3

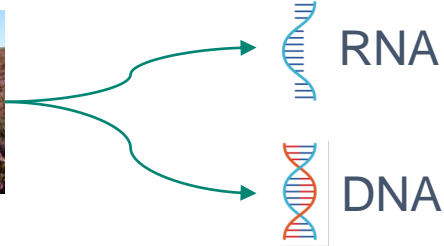


## Comparative evaluation of soil DNA extraction kits for long read metagenomic sequencing

Harry T. Child, Lucy Wierzbicki, Gabrielle R. Joslin and Richard K. Tennant\*



heathland

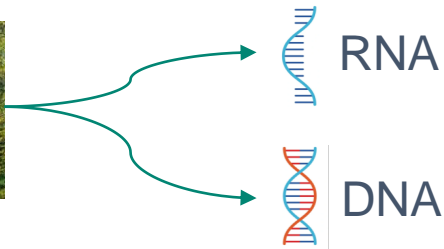


Heath metaT long reads

Heath metaG long reads



woodland



Wood metaT long reads

Wood metaG long reads

```
conda activate metatranscriptomics
```

```
cd /home/train/longTREC/day4/notebooks/metatranscriptomics
```

```
jupyter notebook
```