#### Single Cell Genomics and Transcriptomic for Unicellular Eukaryotes

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# Single Cell Genomics and Transcriptomics for Unicellular Eukaryotes

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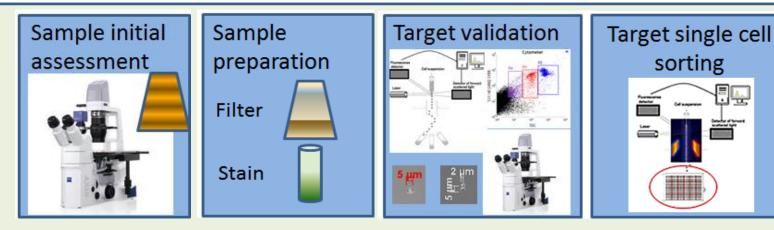


#### Introduction

Unicellular eukaryotes have complex genomes with a high degree of plasticity that allow them to adapt quickly to environmental changes. They live with prokaryotes and higher eukaryotes, frequently as symbionts or parasites. The vast majority of eukaryotic microorganisms are uncultured or unculturable, and thus not sequenced so far. To this day their contribution to the dynamics of the environmental communities remains to be understood. Here, we present four components of our approach to isolate, sequence and analyze eukaryotic microorganisms: target isolation and genome/transcriptome recovery for sequencing; sequence analysis for single cell genome and transcriptome, and genome annotation. We have tested some of our tools and some are being still tested, using six species: an uncharacterized protist from cellulose-enriched compost identified as *Platyophrya*, a close relative of *P. vorax*; the fungus Metschnikowia bicuspidate, a parasite of water flea Daphnia; the mycoparasitic fungi Piptocephalis cylindrospora, a parasite of Cokeromyces and Mucor; Caulochytrium protosteloides, a parasite of Sordaria; Rozella allomycis, a parasite of the water mold Allomyces; and the microalgae Chlamydomonas reinhardtii.

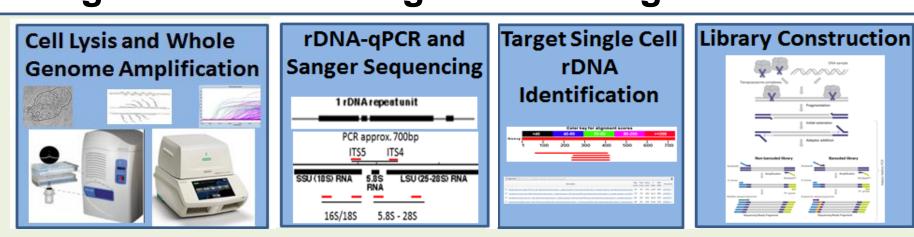
#### **METHODS: LABORATORY PROCESS BEFORE SEQUENCING**

#### Single Cell Isolation Critical Steps



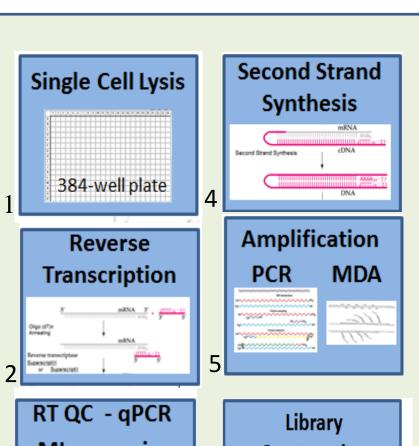
Sample initial assessment: Morphology and standard DNA stains, as well as various specific stains are used for identifying the target, among the heterogeneous content of the environmental samples. Sample preparation: Separation of different size populations is done by filtering and/ or pre-sorting, which is followed by target validation using the cell sorter and the microscope, to identify the correct population to be used for sorting into 384-well plates

#### **Single Cell Processing After Sorting for Genomics**



Cell Lysis: first critical step for genome recovery of single cells. Several methods have been tested for efficient eukaryote single cells. Whole genome amplification (WGA) is the next critical step. Several parameters are being tracked: MDA "start" time – likely to be reflective of cell lysis and DNA denaturation efficiency; possible reflective of the genome coverage; MDA total time - directly proportional with degree of amplification bias; rDNAqPCR: We have tested several primer sets for eukaryotic rDNA region, for 18S, ITS and 28S subunits. Currently we are using 18S and ITS regions and NCBI database. Library constructions: we tested several different protocols for Illumina method.

### Single Cell Transcriptomics Method Development Critical Steps



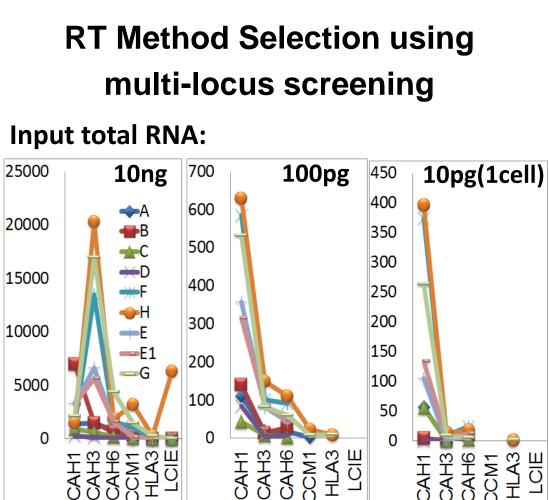
- ML screening
- Illumina; Mondrian

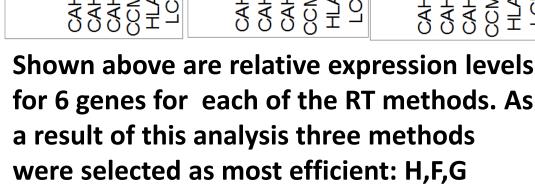
- throughput format; compatibility with the downstream process and chemistry; transcriptome recovery; time; cost; purity of the reagents. Commercial kits, versus direct lysis and LiCI -based lysis were tested on single cells. 2. Eight Reverse Transcription methods were tested on purified total RNA in amounts equivalent to 1000; 100; 10 and 1 cells

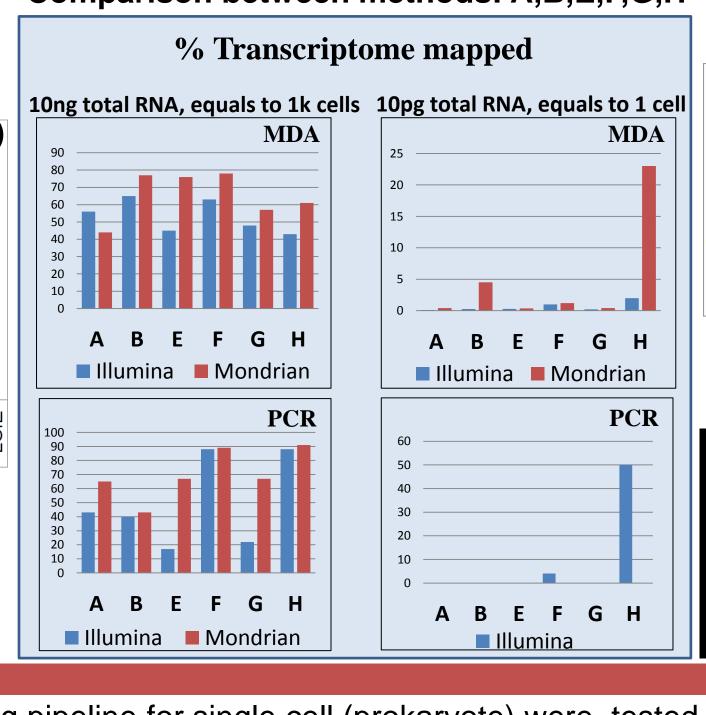
1. Several lysis methods has been tested for single cell transcriptomics, selection criteria were: compatibility with high-

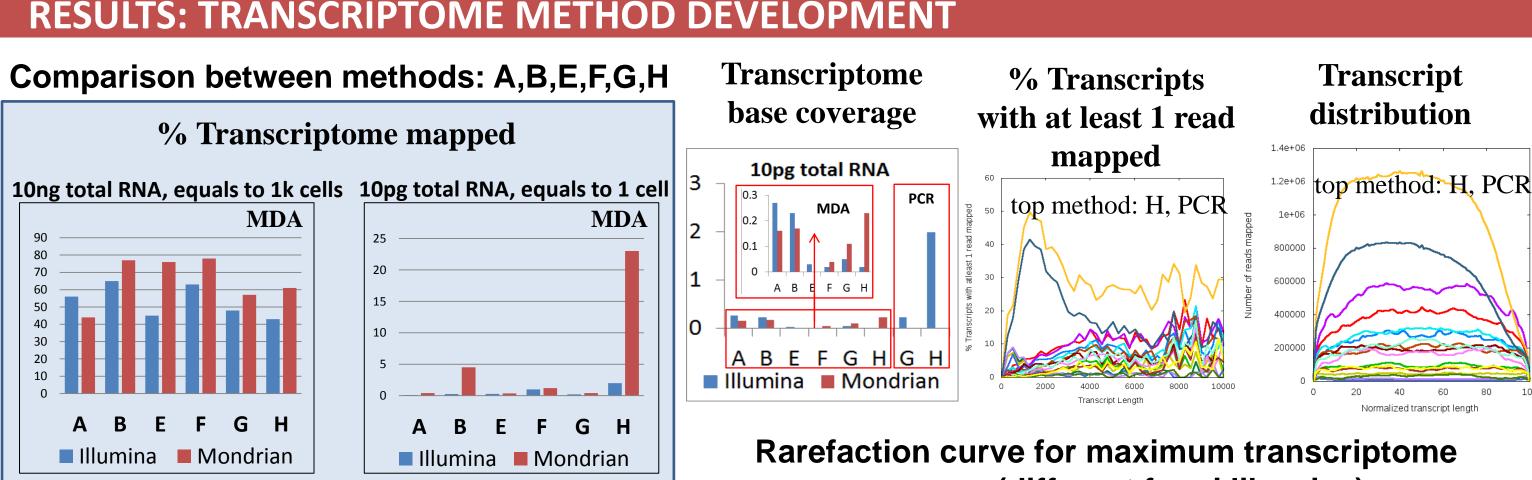
- for single cell eukaryotes. Methods tested were: Superscript II (A); Superscript III (B); Thermoscript (C); PrimeScript with gDNA eraser (D), for all following manufacturer protocol; Superscript II and Superscript III with essential chemistry modifications (E; E1) and (F) respectively; SmartSeq2 (Nature Methods, Vol10 NO11:1096-1098 (G); SmartSeq2 modified protocol and components (H).
- 3. Reverse Transcription Quality Check was done using six C.reinhardtii 4a+ genes, shown to have a high correlation with tRNAseq transcriptome analysis (Cell, Vol.24:1876–1893, May 2012).
- 4. Second Strand Synthesis was performed differently for different RT methods. Efficiency was estimated in preliminary tests, not shown here.
- 5. Amplification of the cDNA was tested by T7-IVT, PCR or MDA. First method was dropped from further experiments due to much higher costs, however, it did show a higher efficiency than PCR or MDA.
- 6. For the library construction three methods are being tested: Illumina Fragment 500bp; Mondrian (Ovation SP+ for Ultra low input) and Nextera XP for low input.

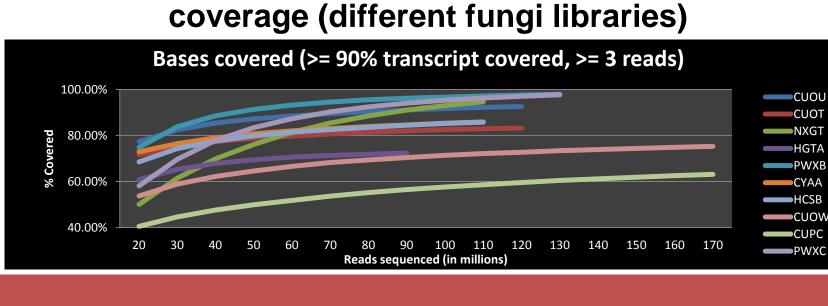
#### **RESULTS: TRANSCRIPTOME METHOD DEVELOPMENT**







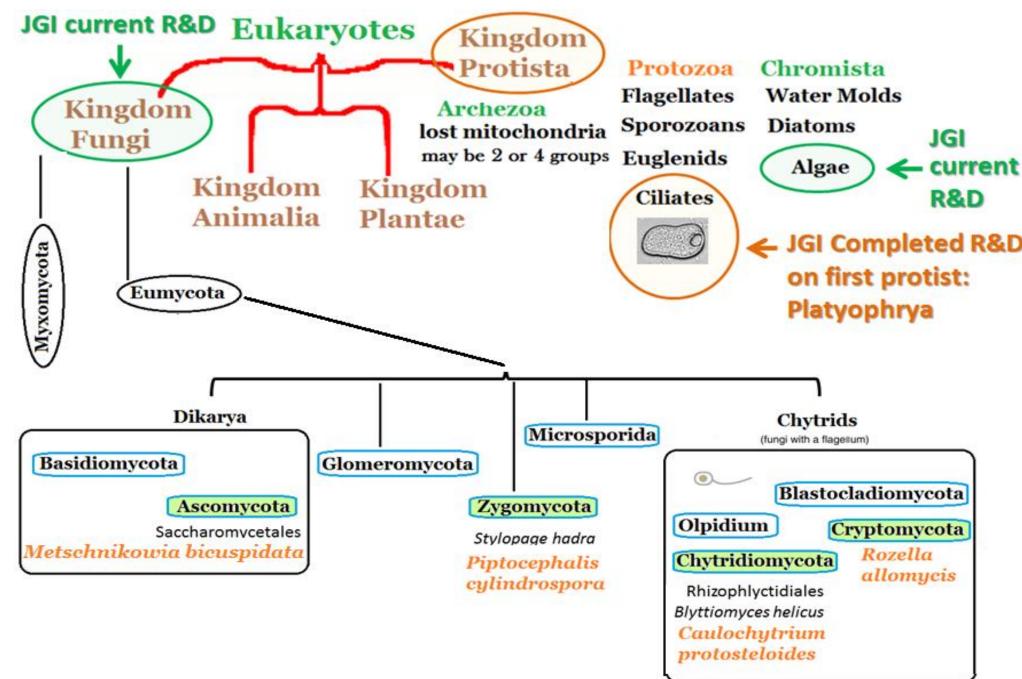




distribution

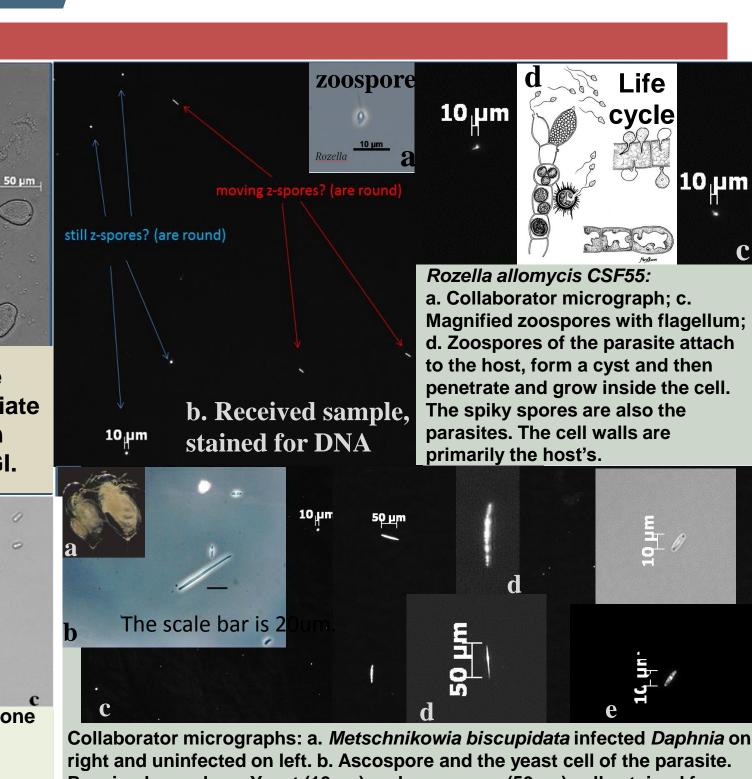
- Several modifications to the existing pipeline for single cell (prokaryote) were tested in order to obtain quality data for single cell eukaryotes.
- Tested modifications affect following major parts of the pipeline: Single Cell Isolation Steps; Single Cell Genome Recovery; Genome Assembly and Annotation. Implemented modifications show good results.

## Single Cell Eukaryote Sequencing at JGI



Samples a. Compost sample from JBEI, enriched with microcrystalline cellulose, stained for DNA. b. Protist forming cysts- intermediate form; c. Protist active form, moving and feeding around or on the microcrystalline cellulose. d. Life cycle as observed at JGI.

host cell. b.Received sample, stained for DNA shows a heterogeneous detect smaller cells. d. Overlap of BF and FL shows two spores of the parasite with bright nucleus.



DNA; d. Ascospore magnified; e. yeast cell BL and FL.

#### METHODS: SEQUENCE ANALYSIS TOOLS for SINGLE CELL

#### **Genome Assembly**

#### **Co-Assembly Strategy Comparison for Compost Protist** on Normalized Data

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assembler	number of contigs	contig N50	Longest contig	assembled genome size	assembler estimated genome size
<b>IDBA-UD</b>	412,972	381 bp	29,832	157.1 MB	n/a
Single cell pipeline	8,933	2.2 kb	27,532	18.4 MB	150 MB
metagenome pipeline	96,312	3.1 kb	72,415	115.3 MB	n/a
<b>SPAdes</b>	94,876	635 bp	6,323	50.8 MB	n/a

## Co-Assembly Strategy Comparison for Piptocephalis cylindrospora

assembler	number of contigs	contig N50	assembled genome size
metagenome pipeline	5987	3.0 KB	9 MB
SPAdes	6102	7.3 KB	10.9 MB
		-	

Several assembly strategies were tested using normalized and raw data for single cells and co-assemblies. The current assembly strategy for these projects is to use SPAdes without normalization. This is the same approach that is used now on microbial single cell projects at JGI.

### **Annotation**

**Protist Analysis:** Annotation pipeline was run on 47675 scaffolds with length > 500bp. For gene prediction we used ab initio method fgenesh, with parameter specifically trained for ciliates, as well as protein-homology based methods, like genewise and fgenesh++ using alternative genetic code 6.

Fungal Analysis: For P.cylindrospora was used JGI eukaryotic annotation pipeline on a combined assembly of 3 single cells

protosteloides

Metschnikowia

bicuspidata, yeast

**Transcriptome Analysis** Preprocessing: Read1 from the fastq files was extracted and all statistics were calculated from only read1 data. Reads were trimmed for the primer sequences followed by Illumina artifacts.

% transcriptome mapped: Reads were mapped to the reference transcriptome. Number of reads that mapped to the transcriptome was represented as a percentage of total number of reads generated. % Transcriptome covered: Reads were mapped to the reference

transcriptome. Absolute number of bases in the transcriptome covered by reads was extracted and represented as a percentage of the entire transcriptome length.

Transcript distribution plot: For each transcript, the number of reads mapping at every base position was calculated. This number was averaged across all the transcripts after normalizing the transcripts to a length of 100 bases. This plot shows if the reads were evenly distributed across the entire length of the transcript.

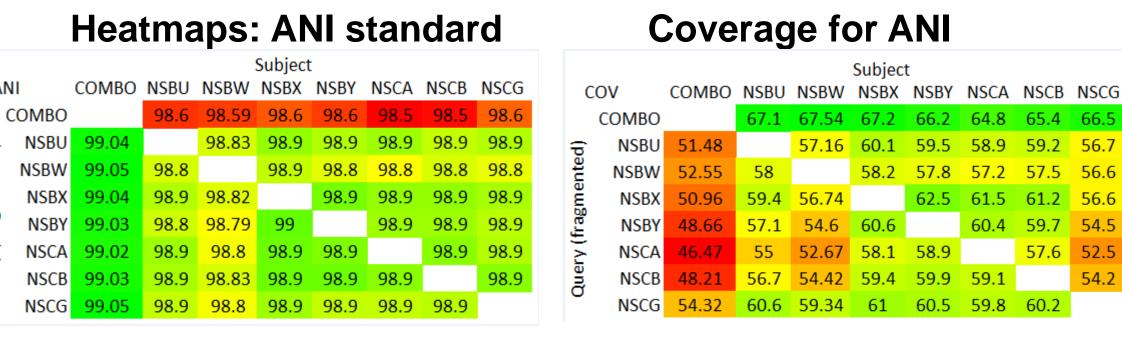
% transcripts with at least 1 read mapped: Transcripts were binned based on their lengths. For each bin, numbers of reads mapped to the transcripts were calculated. Percentage of transcripts within the bin having at least 1 read is calculated and plotted. This plot shows how many transcripts at a given length had at least 1 read mapped to it.

13 (100cell)

5%-10%

#### **RESULTS: GENOME ANALYSIS**

### Protist rDNA (18S) 1753bp HiSeq sequence has 99% Identity with Platyophrya vorax



Protist: ANI stands for average nucleotide identity. The coverage heatmap shows the percentage of the genomes that were used for the ANI calculation, i.e. had hits above the cutoff (>70% identity over >70% of the fragment, fragment size was 1020 bp).

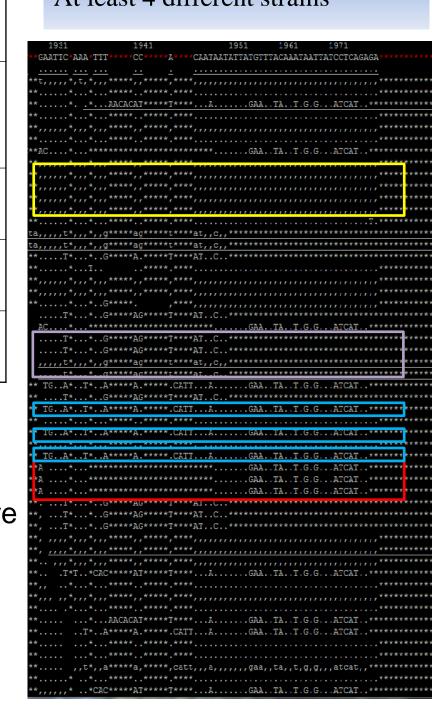
#### **Organism** reads 1cell **Piptocephalis** cylindrospora 10-20% 4.9 (1 cell) RSA2659 Rozella allomycis 20 (100cell) 7 (1 cell) CSF55 Caulochytrium

Fungal Single Cell Assembled Genomes

Protist Analysis: Preliminary analysis based on PFAM domains, predicted on all possible potential ORFs, indicated that most of the scaffolds are from some unknown ciliate, which uses alternative genetic code, where TAA and TAG codons code for glutamine Q (translation table 6). Pipeline predicted 40,072 gene models, with ~65% of models having homology to KEGG database proteins and ~61% to Swissprot proteins. ~45% of genes have at least one Pfam domain and ~56% are complete (from start codon to stop codon). Closest species with sequenced genomes to this protist are ciliates Paramecium tetraurelia and Tetrahymena thermophila, whith whom it shares 4839 and 4765 orthologs respectively (~44-45% percent identity on amino acid level), based on bidirectional BLAST hits. Completeness of genome based on CEGMA analysis of core eukaryotic genes was estimated at 94.3%. Fungal Analysis: Piptocephalis cylindrospora RSA2659 assembly filtered to 8.2 Mb in 1000 contigs indicates 3300 genes with median length of 1074. (median: exon length 216bp; intron 82bp, transcript length of 924bp and 2050 spliced genes. Gene density of 403.02 Mbp. Based on CEGMA analysis of core genes, completeness of genome is estimated at 75.5%

## Rozella allomycis

polymorphism At least 4 different strains



#### CONCLUSIONS • One of the bottlenecks in single cell eukaryote analysis is the scarcity of rDNA data in the form of curated databases, this area needs further development.

• A new capability for unicellular eukaryotes has been under development and preliminary results indicate that single cell eukaryote transcriptomics could be used as a complementing step for the single cell eukaryote pipeline. One best method has been determined and together with few other methods are currently being tested on single cells for their performance consistency.

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