# Using co-activity networks to reveal the structure of planktonic symbioses in the global ocean

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GT BIOSS annual meeting July, 2nd-3rd 2018

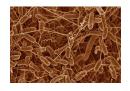




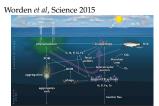
### **ENVIRONMENTAL GENOMICS**

### **Microbes**

- Everywhere, but >90% not cultivable
- Live in complex communities
- Various ecological roles (biogeochemistry, host-nutrition and development, ...)



Electrically conductive nanowires in *Shewanella oneidensis*. Photo by R. Bencheikhand B. Arey





Chemocline bacterial community of Lake Dagow. Overmann & van Germeden 2000

# LAST DECADE EFFORTS: "PLANET-SCALE" SAMPLING

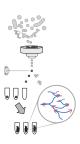


Tara Oceans expeditions for the sampling of marine microbiome

But also Host-associated (Human Microbiome Project), Soil, Oilseep, Hydrothermal...

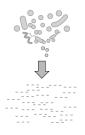
# **ENVIRONMENTAL GENOMES**

# **Single Amplified Genomes**



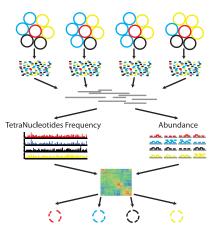
- Experimentally challenging
- Amplification
- Incomplete genomes

### Metagenome Assembled Genomes



- Shotgun sequencing (cheap)
- Already available data
- Contamination

# METAGENOMES ASSEMBLED GENOMES (MAGS): EXAMPLE OF METABAT



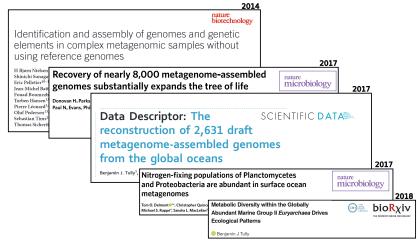
#### Preprocessing

- Samples from multiple sites or times
- Metagenome libraries
- Initial de-novo assembly using the combined library

#### MetaBAT

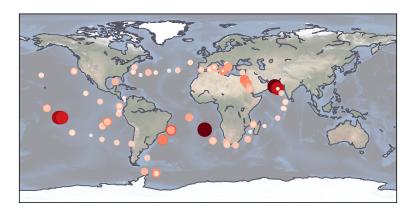
- Calculate TNF for each contig
- Calculate Abundance per library for each contig
- Calculate the pairwise distance matrix using pre-trained probabilistic models
- Forming genome bins iteratively

# LIST OF MAGS PUBLICATIONS



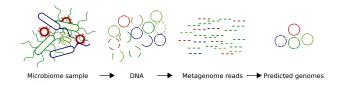
Intense filling of databases, but not so much is currently done with this new information

# CAN WE PREDICT, CARACTERIZE AND EXPLAIN THE COMMUNITIES OF ENVIRONMENTAL GENOMES?



Repartition of 1378 MAGs extracted from Tara Ocean (→2015)

# CO-ACTIVITY: WHO GROWS WITH WHOM?



### **Tools**

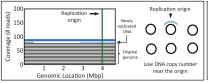
- Growth dynamics of gut microbiota in health and disease inferred from single metagenomic samples Korem et al, Science 2015
  - $\rightarrow$  only complete genomes, code not available
- Measurement of bacterial replication rates in microbial communities

Brown et al, Nature Biotechnology 2016

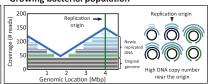
→ adapted for draft-quality genomes, code on Github

# INFERENCE OF MICROBIAL GROWTH DIRECTLY FROM METAGENOMIC SAMPLES

#### Non-dividing bacterial population



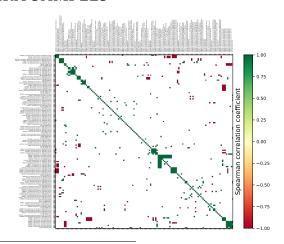
#### Growing bacterial population



$$PTR = iRep = \frac{\texttt{Ori}_{cov}}{\texttt{Ter}_{cov}} \ge 1$$

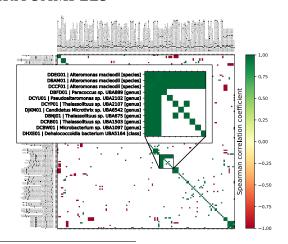
Quantitative in situ measurement of the replication rate

# GROWTH CORRELATION BETWEEN 556 MAGS IN 172 TARA SAMPLES



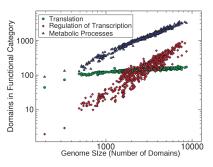
Data: *near-complete* "Tara" MAGs from Parks *et al*, Nature Microbiology 2017; Tara Oceans samples

# GROWTH CORRELATION BETWEEN 556 MAGS IN 172 TARA SAMPLES



Data: near-complete "Tara" MAGs from Parks et al, Nature Microbiology 2017; Tara Oceans samples

# FUNCTIONAL CONTENT OF PROKARYOTIC GENOMES: SCALING LAWS OF LAB-CULTIVATED STRAINS



# Scaling laws

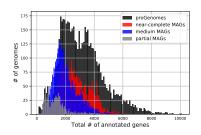
$$n_c = \beta_c \times n^{\alpha_c}$$

 $n_c$ : number of gene in cat c n: total number of genes

- Uncovered from ~700 (lab-cultivated) prokaryotes
- What about environmental genomes?

# FUNCTIONAL ANNOTATION OF ENVIRONMENTAL GENOMES

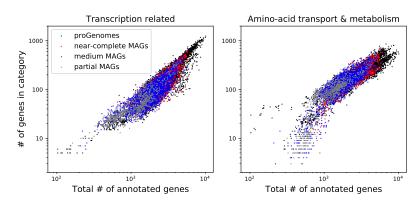
- Annotation pipeline (Prodigal/eggNOGmapper)
- 8000 MAGs annotated along ~25k complete genomes



### **Functional annotation databases**

- Strategies: Orthologous groups (eggNOG) VS protein domains (pfam)
- Annotations: eggNOG (50%), KEGG (30%), Gene Ontology terms

# SCALING LAWS IN MAGS



Could "social" prokaryotes be functional outliers in such laws?

Work in progress...

## Wrapping up

# In summary...

- Microbial diversity largely unknown
- Intensive experimental (sampling and sequencing) and theoretical (genome prediction) research efforts to uncover new environmental genomes
- We try to accumulate clues to predict associations

# Perspective

- Revisit scaling laws at the ecosystem level
- Add more clues of associations (metaT?)
- Next step: reconstruct metabolic models of consortia to explain microbe social interactions

# THANK YOU FOR YOUR ATTENTION

### Close collaborators

- Samuel Chaffron
- Damien Eveillard
- Marko Budinich Abarca







