Network analysis reveals statistical associations between cyanophage host genes and cyanobacterial ecotypes across ocean basins

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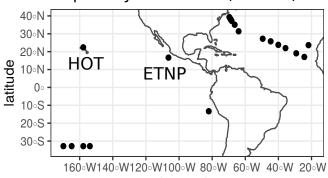
## Introduction

- Cyanophage harbor genes for host functions (Breitbart 2012).
  - Eg. Photosystem II (psb), Purine synthesis (pur)
- Different ecotypes of Prochlorococcus are adapted to different conditions (Johnson et al. 2006). Do cyanophage that infect different

ecotypes have different host genes?

## Methods

- Cyanophage host genes and cyanobacterial ecotype abundances were obtained from publicly available metagenome libraries (Figure 1).
- Viral host genes were identified by placing sequences on phylogenetic trees.
- Associations were identified between each viral gene and all cyanobacterial ecotypes + environmental and location parameters
- With many individual Lasso regressions
- Each lasso has the same manually selected penalty coefficient ( $\lambda = 0.2$ ).



longitude
Figure 1. Geographic locations from which samples are collected. Samples were from geotraces cruises GA03 (North Atlantic, East Coast North Atlantic, West Coast North Atlantic) and GP13 (South Pacific) (Biller et al. 2018); from the Hawaii Ocean Time-series (year Aug 2015; Luo et al 2020). ETNP is Fuchsman et al 2017. ETSP is Fuchsman et al (in revision).

### Acknowledgements

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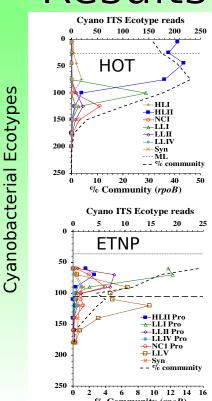


Figure 2. Prochloroccus ecotype relative abundances at HOT (Aug 2015; oxic), and ETNP (anoxic). Grey dotted line....base of mixed layer. Black dashed line--top of anoxic zone  $(<10 \text{ nM O}_2).$ 

#### **Example Correlations**

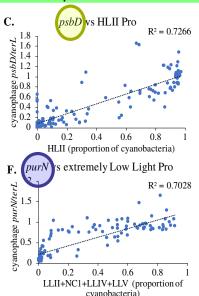


Figure 4. Example correlations between viral host gene ratios and cyanobacterial ecotype abundance. Data are from all stations in Figure 1, not just those shown in Figure 2.

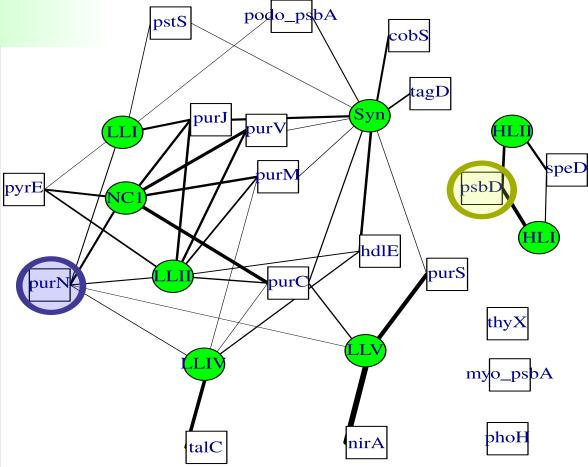


Figure 5. Association network between cyanobacterial ecotypes 📵 and host gene ratios 🖂 Edge widths are associated with lasso coefficient scores and indicate stronger associations.

# Cyanophage Host Gene Ratios Viral Host Gene/terL HOT HOT Viral Host Gene/terL **ETNP ETNP**

Figure 3. Ratios between cyanophage genes coding for different host functions and the cyanophage terL core gene. Higher values indicate greater expression of these genes by cyanobacterial viral factories.

## Discussion

- We have a system for identifying putative assocations between viral host gene abundance and cyanobacterial ecotypes.
- It appears that there are different cyanophage ecotypes that associate with different cyanobacterial ecotypes.
- Cyanophage appear to use different genes to adapt to the different cyanobacterial

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