Development of a Hydrogel-based Biocompatible Platform for Studying Metabolic Interactions between Algae and Bacteria

by

Hyungseok Kim

B.S., Seoul National University (2017)

Submitted to the Department of Mechanical Engineering in partial fulfillment of the requirements for the degree of

Master of Science in Mechanical Engineering

at the

MASSACHUSETTS INSTITUTE OF TECHNOLOGY

May 2020

© Massachusetts Institute of Technology 2020. All rights reserved.

| Author | |
|---|--|
| | Department of Mechanical Engineering |
| | May 15, 2020 |
| Certified by | |
| , i i i i i i i i i i i i i i i i i i i | Cullen R. Buie |
| | Associate Professor |
| | Thesis Supervisor |
| Accepted by | 7 |
| | Nicolas Hadjiconstantinou |
| | Graduate Officer, Department of Mechanical Engineering |

Development of a Hydrogel-based Biocompatible Platform for Studying Metabolic Interactions between Algae and Bacteria

by

Hyungseok Kim

Submitted to the Department of Mechanical Engineering on May 15, 2020, in partial fulfillment of the requirements for the degree of Master of Science in Mechanical Engineering

Abstract

Metabolic interaction between algae and bacteria is an essential topic to develop algal crops as a source of biofuels and to understand nutrient cycling in ocean ecosystems. To date, studying chemical exchange between these microbial species based on molecular diffusion processes has been chellenging due to a lack of an appropriate co-culture system. In this thesis, a hydrogel-based biocompatible platform is proposed to study the interaction between algae and bacteria in a systematic way. By using this platform, different species of microorganisms are physically separated each other by culturing them in individual wells, while allowing an exchange of metabolites by chemical diffusion through the nanoporous hydrogel wall. In the first chapter, I discuss ongoing efforts to understand interaction between algae and bacteria and experiments to culture algal species. In the second chapter, I introduce the hydrogelbased platform and discuss how it can be designed to incubate microorganisms with a spatially controlled biomolecular diffusion. In the final chapter, I discuss a community structure of associated bacteria co-cultured with their algal host *Phaeodactylum tricornutum*, which is shaped by diffusion process using the hydrogel-based platform.

Thesis Supervisor: Cullen R. Buie Title: Associate Professor

Acknowledgments

I would like to thank my advisor, Professor Cullen R. Buie, for his invaluable guidance and inspirations throughout the study. His careful and consistent advisory has supported me to withstand during my first graduate program at MIT.

The accomplishment in my Master's program would not have been made without the advice from my colleagues in the Laboratory for Energy and Microsystems Innovation. I would like to thank Dr. Christopher A. Vaiania and Dr. Chelsea Catania for training me on the essential microbiological techniques and on the fabrication of hydrogel devices. I would like to thank Sijie Chen and Dr. Po-Hsun Huang for providing sincere comments to help me continue the research and graduate study.

I would also like to thank my research collaborators in Lawrence Livermore National Laboratory, Dr. Xavier Mayali and Dr. Jeffrey A. Kimbrel, for providing insightful ideas to me as a beginning experimentalist in the algal research field.

The experience with my family during the past several months has been particularly extensive; however, I believe it has strengthened my motivation to pursue the graduate study further.

Contents

| 1 | Ove | erview | of metabolic interaction between algae and bacteria | 15 |
|----------|-----|---------|---|------|
| | 1.1 | Algae | as biofuel source | 15 |
| | 1.2 | Phyco | sphere and bacterial community | 16 |
| | 1.3 | Metab | polic interaction between algae and bacteria | 17 |
| 2 | Cul | ture a | nd maintenance of algal species | 19 |
| | 2.1 | Prepa | ration of seawater media and transfer of algal cultures \ldots . | 19 |
| | 2.2 | Growt | th of axenic and xenic <i>Phaeodactylum tricornutum</i> | 20 |
| | | 2.2.1 | Materials and methods | 21 |
| | | 2.2.2 | Results and discussion | 22 |
| 3 | Hyo | drogel- | based diffusion assay for studying bacterial growth | 25 |
| | 3.1 | Backg | round | 25 |
| | 3.2 | Mater | ial characterization of hydrogel-based platform | 27 |
| | | 3.2.1 | Synthesis of nanoporous structured poly(2-hydroxethyl methacryl | ate- |
| | | | $co\mbox{-ethylene}$ glycol dimethacrylate) (HEMA–EDMA) | 27 |
| | 3.3 | Hydro | gel-based antibiotics diffusion assay for incubating Escherichia | |
| | | coli . | | 29 |
| | | 3.3.1 | Materials and methods | 29 |
| | | 3.3.2 | Results and discussion | 31 |
| | 3.4 | Comm | nunication between genetically engineered <i>E. coli</i> strains in hydroge | l- |
| | | based | assay | 33 |
| | | 3.4.1 | Materials and methods | 33 |

| | | 3.4.2 | Results and discussion | 35 | |
|---|--|---------|--|----|--|
| | 3.5 | Conclu | uding remarks | 38 | |
| 4 | Hyo | łrogel- | based co-culture platform for studying bacterial commu- | | |
| | niti | es witł | n algal host | 41 | |
| | 4.1 | Backg | round | 41 | |
| | 4.2 | Mater | ials and Methods | 42 | |
| | | 4.2.1 | Strains and culturing conditions | 42 | |
| | | 4.2.2 | Experimental design and preparation of hydrogel platform $\ .$. | 42 | |
| | | 4.2.3 | Sample collection, sequencing and analysis | 44 | |
| | 4.3 | Result | s and discussion | 44 | |
| | | 4.3.1 | Bacterial communities are spatially affected by diffusion of algal | | |
| | | | exudates | 44 | |
| | | 4.3.2 | Individual bacterial taxa have unique growth dependency to | | |
| | | | algal host | 45 | |
| | 4.4 | Limita | ations and future work | 46 | |
| A | MATLAB code for counting the number of algal cells from micro- | | | | |
| | scoj | pe ima | ges | 49 | |
| в | 3 MATLAB code for visualizing absorbance reads from plate reader | | | | |
| | (hy | drogel | device multiwell design) | 51 | |
| С | Shortcomings in mutiwell hydrogel devices 53 | | | | |

List of Figures

- 2-2 Summarized results of growth measurements of axenic *P. tricornutum* and co-culture with *Marinobacter* sp. 3-2 in 96-well plate. (a) Maximum chlorophyll flourescence during the incubation period under different concentration of bicarbonate sodium. (b) Maximum growth rate of algal cultures calculated using Equation 2.1 during the incubation period under different concentrations of bicarbonate sodium.

23

24

30

- 3-1 Experimental setup for incubating *E. coli* in hydrogel-based diffusion assay. (a) Side view of hydrogel device and its container where the water is constantly evaporated from the bottom and keeps the device hydrated. (b) Top view of a device where an antibiotic can diffuse through hydrogel barrier and affects the growth of *E.coli* plated in each well.

- 3-2 (a) Growth measurements of *E. coli* after 6 h incubation in a hydrogel device treated with three different antibiotics. (b) Molecular structure of carbenicillin, tetracycline and kanamycin used in the experiment. 32
- 3-3 Schematic diagrams of hydrogel devices to co-culture producer and indicator strains. (a) A hexagonal design with the same dimensions as antibiotics diffusion assay (see Figure 3-1). Wells are outlined for which cultures were sampled to quantify the cell abundance. (b) A multiwell design compatible with using multichannel pipettes. Wells plated with producer strain are denoted with red color and indicator strain with beige color.

34

- 3-4 Cell abundance measurements of indicator strain (BL21 AMK77, K12 T9002) in hexagonal hydrogel devices. Indicator strain is either co-cultured with BL21 AMK75 (test) or monocultured with BL21 AMK77 (control). Averages of 4 measurements are displayed with standard deviation. Experiments repeated twice with indicator strain BL21 AMK77 (first two graphs) and once with strain K12 T9002 (third graph). 36
- 3-5 Visualization of cell abundances in multiwell hydrogel devices. Here
 BL21 AMK75 and BL21 AMK77 strains are used as a producer and indicator strain respectively. In each experiment, strains were co-cultured (a) simultaneously for 16 h, (b) sequentially for 6 h or (c) sequentially for 13 h.

| 4-1 | Schematic diagram of experimental setup for incubating $P.\ tricornutum$ | |
|-----|--|----|
| | and bacterial communities in a hydrogel device. Bacterial cells are | |
| | plated in surrounding wells located in a hexagonal array having three | |
| | distances from the center. Algal cells (test) or f/2-Si medium without | |
| | cells (control) is plated in the center well | 43 |
| 4-2 | Principal coordinate analysis of bacterial community compositions un- | |
| | der two incubating conditions (with or without algal host at the center | |
| | well) | 45 |
| 4-3 | Principal coordinate analysis of bacterial community compositions in | |
| | each layer under two incubating conditions (with or without algal host | |
| | at the center well). P values were measured from testing permuta- | |
| | tional multivariate analysis of variance with test and control samples. | |
| | Asterisks denote statistical significance from the test at $p \leq 0.005.$ | 46 |
| 4-4 | Mean relative abundance of bacterial communities plotted by genera. | |
| | Values less than 0.5% were removed from the list | 47 |
| C-1 | Schematic diagram displaying wells that were contaminated by droplets | |
| | fallen by dewing in multilwell design of hydrogel devices, incubated for | |
| | (a) 6 h and (b) 13 h | 53 |
| C-2 | chematic diagram displaying wells that were dried out by evaporation | |
| | in multilwell design of hydrogel devices, incubated for (a) 6 h and (b) | |
| | 13 h | 54 |

List of Tables

| 3.1 | Chemical properties and concentrations of three antibiotics used in the | |
|-----|---|----|
| | experiment [5]. \ldots \ldots \ldots \ldots \ldots \ldots \ldots \ldots | 32 |
| 3.2 | Bacterial strains used in the experiments | 34 |
| 3.3 | Experimental conditions for co-culturing E. coli strains in hydrogel | |
| | devices (P: producer strain, I: indicator strain). | 35 |

Chapter 1

Overview of metabolic interaction between algae and bacteria

1.1 Algae as biofuel source

Algae are considered as one of the promising renewable energy sources due to their high lipid productivity per area compared to other biofuel candidates such as land crops [31]. To cultivate a large amount of biomass for lipid production, it is critical to develop a system that allows a stable, scalable and cost-efficient environment for growing algal cells. Two widely known methods to meet these criteria are an outdoor open pond systems and closed bioreactors. Open pond systems allow algal species to grow under outdoor environment in a mass scale. On the other hand, closed bioreactors provide a more stable and controllable physiological condition for algae, however they require a higher cost to maintain throughout the incubating period [7, 11].

One major challenge dealing with a large scale of algal biomass is that various environmental conditions drive the system to become difficult to predict. Such conditions include fluctuating physiological parameters (sunlight, temperature) or an intrusion of unwanted microorganisms. Specifically, the culturing system produces large amounts of dissolved organic carbon via photosynthesis which is a nutritional source for hetetrotrophic microorganisms. This can sometimes result in a culture failure (pond crash) if the intrusive microorganisms produce any algicidal compounds [10].

1.2 Phycosphere and bacterial community

Although the intrusion of heterotrophic bacteria to a mass algal culture is inevitable, effort has been made to study how bacterial communities can coexist with the algal host. In general, a growth of heterotrophic bacteria is supported by metabolites produced by algae which called dissolved organic carbon (DOC).

On the single cell scale, there is a zone where algal exudate nutrients are rich and allows bacterial cells to thrive, called the "phycosphere" [1]. It has been hypothesized that the phycosphere would play a central role in algal-bacterial interaction due to a higher concentration of DOC can be generated near the algal cells by diffusion. A direct visualization of the phycosphere was carried on by imaging movement of chemotactic bacteria in real-time that gather around a lysed algal cell [34]. By measuring the swimming speed of bacteria that is correlated to the gradient of algal metabolite concentration such as dimethylsulphoniopropionate [33], the researchers were able to verify that chemotactic activity can increase near the algal cell.

Another strategy for bacteria to exploit the algal exudates is by direct attachment. A number of bacterial species have been identified to show an ability to attach to the algal cell surface, especially for algicidal bacteria [22]. It has recently been revealed that long-term outdoor cultivation of algal species can create a favorable condition for heterotrophic bacteria to form a biofilm on the algal cell surface [30, 20]. Furthermore, it has been shown that a long-term co-cultivation of algae with environmental bacterial communities can uniquely shape the structure of bacterial communities [19].

1.3 Metabolic interaction between algae and bacteria

Although a variety of bacterial taxa have been found to co-exist with algal cultures in the natural environment, analyzing detailed interaction between algae and bacterial communities has been difficult due to the complex nature underlying the multispecies system. Overall, marine bacteria use organic carbons exuded by diatoms for the growth and convert them into carbon dioxide. Generally called as a remineralization, the process can take a major part in carbon cycling in the ocean [1].

On the other hand, certain species of bacteria can produce micronutrients that can affect the growth of algal host. One of the widely known micronutrients that is known to enhance algal growth is vitamins such as cobalamin (viatamin B12). Cobalamin has been long recognized as a requirement for many algal species since the cells do not have the metabolic ability to produce it. Another widely known micronutrient is metal ions such as iron which exists as a small organic compound (siderosphere) in aquatic environment. It has been revealed that vibrioferrin, one of the iron complex of siderospheres, can be produced by ocean bacteria such as the genus *Marinobacter* [2].

Parasitism between algae and bacteria has also widely been reported which plays a major role in terminating algal bloom in the ocean. Algicidal compounds that are produced by bacteria can span a wide variety of chemical structures depending on the algal host and bacterial species [25].

Chapter 2

Culture and maintenance of algal species

To study algal species in a laboratory requires a proper practice to maintain algal culture without any external contamination. This section describes a protocol to prepare glassware and seawater media that are used to culture algal species and a measurement of growth using cell count and fluorescence of chlorophyll.

2.1 Preparation of seawater media and transfer of algal cultures

F/2 media is one of the widely used nutrient-enriched seawater for culturing algal species. When using commercially available seawater, sea salt (Instant Ocean, Blacksburg, VA) was first dissolved into deionized water (final concentration 30 g L⁻¹) which was then filtered with 0.2–1 µm pore membrane to remove particulates. Then nutrient stocks were sequentially added as follows: 0.1% v/v of 75 g L⁻¹ sodium nitrate (Sigma-Aldrich), 0.1% v/v of 5 g L⁻¹ sodium phosphate monobasic monohydrate (Sigma-Aldrich), 0.1% v/v of 30 g L⁻¹ sodium metasilicate nonahydrate (Sigma-Aldrich), 0.1% v/v of trace metal solution (direct purchase from National Center for Marine Algae and Microbiota) and 0.05% v/v of vitamin solution. Vitamin solution stock was prepared by adding 200 mg thiamine hydrochloride, 100 mg L⁻¹ biotin and 1 g L⁻¹ cyanocobalamin to a liter of deionized water. After adding stock nutrients the medium was autoclaved and stirred for several hours to allow ambient air to dissolve into the media with final pH ~8.0. As silicic acid can enhance precipitation during the autoclaving procedure, it is preferred not to add when culturing algal species that do not require silicate to grow (called as f/2-Si media).

Axenic and co-culture algal stocks were regularly transferred on every 2–3 weeks by inoculating 100 µL culture into 7–10 mL f/2-Si media in glass tubes. To check for any contamination between cultures, samples were streaked on Zobell marine broth agar plate (15 g L⁻¹ agar, 1 g L⁻¹ yeast extract, 5 g L⁻¹ peptone in filtered seawater) and incubated at 30°C for 2–3 days until bacterial colonies start to appear. Algal stocks were maintained under a batch condition at 20°C in a 12 h light/12 h dark diurnal cycle (200 µmol m⁻²s⁻¹).

2.2 Growth of axenic and xenic *Phaeodactylum* tricornutum

Examining an abundance of culture is the first step to perform microbial research as it easily provides essential information on cell physiology to design the experiments [4]. In this section a growth experiment of axenic and bacterial co-cultures of algal species *Phaeodactylum tricornutum* is introduced. *P. tricornutum* is widely known as a model species for algal research as its growth is robust in a diverse environment with a high lipid productivity [13] and its genome has been fully sequenced allowing researchers to better understand physiological characteristics [8]. As a model species to co-culture with algae, bacterium *Marinobacter* sp. 3-2 is used in this experiment; genus *Mariobacter* is recognized as bacterial taxon that is commonly found in the ocean environment with algal host. The strain 3-2 has recently been isolated from an outdoor culture of *P. tricornutum* [30].

2.2.1 Materials and methods

Axenic culture of *P. tricornutum* was obtained from the National Center for Marine Algae and Microbiota (NCMA) and maintained in f/2 medium as described in Section 1.2.1. Co-culture stock of *P. tricornutum* and *Marinobacter* sp. 3-2 was created by inoculating a colony (grown on Zobell marine broth agar plate) into axenic algal culture and maintained for 1 year.

For algal growth measurement, stock cultures were inoculated into fresh f/2 medium to achieve a final algal density of $\sim 1 \times 10^5$ cells ml⁻¹. At least three biological replicates of mono- and co-culture were created and incubated as described in Section 1.2.1. Throughout the experiment the following pre-sterilized culture vessels were used for incubation: 50 mL flasks (Corning), 16 mm-diameter glass tubes (Corning) and 96-well plates (Nunc). In order to test the effect of dissolved inorganic carbon on the interaction between *P. tricornutum* and *Marinobacter* sp. 3-2, 0–20 mM sodium bicarbonate was added to the 96-well plate cultures.

Cell abundances were measured on every 24 hours either by counting the number of cells or by reading the flourescence intensity of chlorophyll a. For counting the cell numbers, 12 µL of samples were injected into a hemocytomter which was mounted on an inverted fluorescence microscope (Eclipse Ti, Nikon). Images were taken using Texas Red[®] filter to excite chloroplast of each cell under 4 times of magnification and were processed to count the cells using customized MATLAB codes (Mathworks) (Appendix A). For measuring chlorophyll abundance, a plate reader (Varioskan, Thermo Scientific) was used to read chlorophyll a flourescence intensity with 430/660 nm excitation/emission wavelength, after plating 200 µL samples into 96-well plates. Algal growth rate (μ) was calculated by using chlorophyll flourescence as follows:

$$\mu_N = \ln \frac{(\text{Biomass on day } N)}{(\text{Biomass on day } N - 1)}$$
(2.1)

2.2.2 Results and discussion

Growth of axenic cultures P. tricornutum and co-cultures with Marinobacter sp. 3-2. under different culture vessels were measured by counting the number of cells or by reading chlorophyll flourescence intensities where the results are given in Figure 2-1. When the algal cells were cultured in either glass tubes or flasks, there was no significant difference in cell density between axenic and xenic algal cultures, implying the existence of Marinobacter sp. 3-2 did not affect the cell division of P. tricornutum. However, both axenic and co-cultures reached different maximum chlorophyll flourescence intensities depending on the culture vessels; flasks cultures had ~4 times higher chlorophyll abundance than glass tube cultures whereas cell densities remained similar (Figure 2-1(b)). As flasks provide a higher surface area exposed to air compared to glass tube cultures, it was hypothesized that the aeration may play a role in expressing chlorophyll in algal cultures but not in the rate of cell division.



Figure 2-1: Cell abundances of axenic *P. tricornutum* and co-culture with *Marinobacter* sp. 3-2. (a) Growth of algae measured by cell density under flask and glass tube cultures. (b) Growth of algae measured by chlorophyll abundance under flask and glass tube cultures.

To test the hypothesis axenic and bacterial co-cultures of P. tricornutum were incubated in 96-well plates where sodium bicarbonate was added with concentration ranging 0–20 mM as a source of dissolved organic carbon into the media. During the incubation the cell abundances were tracked by measuring fluorescence intensity of chlorophyll a on every 24 hours. Interestingly, co-culture with *Marinobacter* sp. 3-2 had several folds higher chlorophyll fluorescence compared to the axenic *P. tricornu*tum, even when the bicarbonate sodium was not added to the media (Figure 2-2). Furthermore, the mutualistic effect by *Marinobacter* sp. 3-2 on algal growth declined when sodium bicarbonate was added to the media with a higher concentration.

It is notable that when bicarbonate sodium was added to the media with a higher concentration (5–20 mM), there was no clear difference of growth between axenic and co-culture of *P. tricornutum*, as shown in Figure 2-3 (d-f). One possible explanation could be that the mutualistic interaction was shadowed by a high concentration of bi-carbonate sodium over 5 mM which may no longer create any physiologically-relevant condition.



Figure 2-2: Summarized results of growth measurements of axenic *P. tricornutum* and co-culture with *Marinobacter* sp. 3-2 in 96-well plate. (a) Maximum chlorophyll flourescence during the incubation period under different concentration of bicarbonate sodium. (b) Maximum growth rate of algal cultures calculated using Equation 2.1 during the incubation period under different concentrations of bicarbonate sodium.



Figure 2-3: Growth curves of axenic *P. tricornutum* and co-culture with *Marinobacter* sp. 3-2 measured by chlorophyll a fluorescence under 96-well plate culture, where bicarbonate sodium was added to the media with different concentrations as follows: (a) 0 mM, (b) 1 mM, (c) 2 mM, (d) 5 mM, (e) 10 mM and (f) 20 mM.

Chapter 3

Hydrogel-based diffusion assay for studying bacterial growth

3.1 Background

In nature microbial species exist within communities, where metabolic interaction between microorganisms play a key role to sustain the complex system. One of the most efficient ways that microorganisms interact each other is by exchanging biomolecues cues via diffusion. Molecular transport based on diffusion can take much less time than by convection under an aquatic environment with a lengthscale of a microorganism (known as Kolmogorov scale) [1, 32]. Theoretical calculation also suggests that the microorganism can acquire 50 times more nutrients by molecular diffusion than cellular swimming under low stirring number [37].

To understand how diffusion contributes to microbial communication, attempts have been made to develop an *in vivo* co-culture platform that allows an observation of microbial species under a controlled environment. Membrane-based chambers are a widely accepted method for establishing such environment, which co-cultures two or more microbial species in each chamber where metabolites can diffuse through a porous membrane. Ichip, for example, provides an incubation of yet unculturable microbial species by allowing diffusion of nutrient sources that are provided from the natural samples [27]. Dual-chamber system is another example, two chambers are connected to each other by porous membrane which prevents physical contact but allows chemical communication between the two microbial species. This system has been developed for several biological downstream analyses, such as plate reader-compatible *in situ* growth measurement [26], metabolomics [28], or microscope imaging for tracking cellular swimming [15] and biofilm formation [35].

As these methods have been introduced very recently challenges still exist in enhancing the functionality of the platform. For example, when a permeable membrane is used for molecular diffusion it has not been achieved to design a co-culture platform to incubate and sample more than two species. As the membrane cannot provide a firm support to the platform it is often combined with metal or plastic frame, and leakage can occur when it is sealed with gasket [35]. A frame that permits interaction between multiple species has proven difficult to design.

A fully structured, biocompatible hydrogel is one way to mitigate the issues with cell leakage and platform design that can still allow biomolecules to diffuse through. Photopolymerization of methacrylates can meet such requirements, as the chemical crosslink under ultraviolet light maintains the hydrogel structure under a variety of biochemical conditions as well as providing strong mechanical stability. It has also been proven that the methacrylate-based hydrogel is biocompatible with culturing cells *in vivo*. For example, mammalian cells can be effectively incubated on a layer of poly(2-hydroxethyl methacrylate-*co*-ethylene glycol dimethacrylate) (HEMA–EDMA) [17], where the copolymer has previously used as a surface coating [21] and gel chromatography [12].

With such biocompatibility and mechanical stability of HEMA–EDMA, in a recent paper by Ge *et al.* two engineered *Escherichia coli* strains were co-cultured in a multiwell chamber by maintaining chemical communication without physical contact between each other [16]. As an extension from this work, in the first section of this chapter, a protocol to synthesize HEMA–EDMA is described. In the subsequent two sections, it is shown how biomolecular diffusion can be controlled to affect the microbial growth in the hydrogel-based platform with incubation experiments using *E. coli* as a model species.

3.2 Material characterization of hydrogel-based platform

3.2.1 Synthesis of nanoporous structured poly(2-hydroxethyl methacrylate-*co*-ethylene glycol dimethacrylate) (HEMA– EDMA)

Designing a hydrogel device

When designing a device dimension for microbial incubation it is necessary to consider a physical environment that the cells will be placed under. Typically 100–150 µL well volume can maintain enough cell culture without evaporation loss during several weeks of incubation. Wall thickness is another important parameter as it determines how effective metabolites will diffuse between culture wells. If it is too thin, however, the wall can easily break due to brittle nature of phytopolymerized HEMA–EDMA; at least 1.3–1.5 mm of thickness is preferred to tolerate physical stress applied on the hydrogel. Finally, the design needs to be able to prevent any cross-contamination between adjacent wells, especially by maintaining the hydrogel region dry above the surface of the liquid culture. Ideally this is not possible to achieve because water penetrates into the pores in the hydrogel structure due to capillary effect [18], and this will drag the meniscus of liquid culture near to the top of the device. To minimize the capillarity it is recommended to design a round shaped well and plate culture of a volume less than the half of the single well volume.

Preparation of acrylic and polydimethylsiloxane (PDMS) molds

A CAD software (Solidworks, Dassault Systmes) was used to design a hydrogel device. Drawing files were exported and an acrylic mold was created by lasercutting an 1/4" acrylic sheet (Universal Laser Systems). The surface of acrylic parts was cleaned by deionized water and dried out by blowing compressed air to remove any dust generated from lasercutting process. Acrylic adhesive (Weld-On Adhesive) and epoxy adhesive (3M) were used to attach between acrylic parts and to the container (petri dish). After curing adhesives for ~ 18 h, polydimethylsiloxane (PDMS) (Sylgard 184, Dow Corning) was cast onto the acrylic mold and cured at 80°C for >3 h. PDMS mold was carefully detached from acrylic surface by dispensing isopropyl alcohol into the area between PDMS and acrylic molds.

Surface modification of glass substrate

In order to develop a covalent crosslink with HEMA–EDMA polymer, the glass surface was functionalized to incorporate an anchor-group for methacrylates [17]. In detail, a 75 mm \times 50 mm glass slide was sequentially soaked in 1 M hydrochloric acid for 1 h, rinsed with deionized water, soaked in 1 M sodium hydroxide for 1 h and rinsed with deionized water. After drying the glass surface under the ambient air, 250 µL solution containing 19% 3-(trimethoxysilyl)propyl methacrylate, 76% ethanol and 5% acetic acid was uniformly dropped on the substrate which was repeated twice after 30 min. The solution was removed from the glass slide by throughly rinsing with acetone.

Polymerization of nanoporous HEMA–EDMA

Prepolymer solution HEMA–EDMA was first prepared by mixing a monomer 2hydroxyethyl methacrylate (HEMA; 24 wt.%, Sigma-Aldrich), a crosslinker ethylene glycol dimethacrylate (EDMA; 16 wt.%, Sigma-Aldrich), a porogen 1-decanol (12 wt.%, Sigma-Aldrich) and cyclohexanol (48 wt.%, Sigma-Aldrich) and a photoinitiator 2,2-dimethoxy-2-phenylacetophenone (DMPAP; 1 wt.%), then the mixture was stored at room temperature under no light. The prepolymer solution was cast onto the PDMS mold and a glass slide was carefully placed on the mold with a direction that the pre-treated surface meets the solution (it is important not to allow any bubbles to penetrate into while the glass is being placed). The solution was then polymerized under ultraviolet light with a wavelength 365 nm by using a commercial UV lamp (VWR) for 15 min. The photopolymerized devices were detached from PDMS mold and subsequently stored in a jar containing methanol (VWR), and the solvent was replaced every day twice to remove any porogen and uncrosslinked monomers remaining in the hydrogel. Before the microbial incubation experiment the devices were immersed in an autoclaved glass jar with growth medium for two days (bacteria) or 1–2 weeks (algae).

3.3 Hydrogel-based antibiotics diffusion assay for incubating *Escherichia coli*

After characterizing the material property of polymer HEMA–EDMA, next it was explored whether the microbial growth can be controlled by biomolecular diffusion in the hydrogel device. In the first experiment, three antibiotics were tested to inhibit a growth of wild type *E. coli* through diffusion in the device.

In a disc assay for antibiotics, an agar plate is used where an antibiotic diffuses through the gel matrix uniformly and creates a circular zone where bacterial growth is effectively inhibited [36]. Inspired from this conventional disc assay, an experiment with a multiwell hydrogel device was designed to test diffusion of antibiotics by incubating and measuring the growth of bacteria.

3.3.1 Materials and methods

Preparation of devices and antibiotics

Hydrogel devices were prepared as described in the Chapter 3.2.1, aseptically taken out from LB medium jar, and placed on a sterilized device container. At the bottom of the container 20 mL deionized water was poured to maintain the device hydrated during the incubation period (Figure 3-1(a)). In order to plate cells and an antibiotic on the device, culture medium was completely removed from each well. For test conditions three 10 µL antibiotic solutions (50 mg ml⁻¹ carbenicillin, 25 mg ml⁻¹ kanamycin, 5 mg ml⁻¹ tetracycline in deionized water) were individually plated in the center well located at the device. For a control condition deionized water was plated in the center well, and the experiments were replicated 3–4 times.

Strain and culturing condition

A wild type *E. coli* strain K12 was recovered from frozen glycerol stock by inoculating it into liquid LB medium and grown overnight (37°C, 250 r.p.m.). After diluting the cells at OD_{600} of ~ 0.005, 10 µL culture was directly plated into each well in the device except for the center well.

Experimental setup

The hydrogel devices with container was incubated at 37° C, 250 r.p.m. for 6 h. After the incubation 7 µL cells from each well were sampled and the absorbances (wavelength 600 nm) were measured using a microcuvette (Agilent) and UV-vis spectrophotometer (Shimadzu). In each device, three directions with an equal distance from the center and four distances in a same direction were chosen to measure cell abundances (Figure 3-1(b)).



Figure 3-1: Experimental setup for incubating E. coli in hydrogel-based diffusion assay. (a) Side view of hydrogel device and its container where the water is constantly evaporated from the bottom and keeps the device hydrated. (b) Top view of a device where an antibiotic can diffuse through hydrogel barrier and affects the growth of E.coli plated in each well.

3.3.2 Results and discussion

Inhibition of bacterial growth is spatially affected by antibiotic diffusion

Bacterial abundance from hydrogel well at different distances from the center was measured after 6 h of incubation as shown in Figure 3-2(a). The result showed that the bacterial growth was inhibited less when the culture well was located farther away from the center, suggesting that the amount of antibiotics that has reached to the well decreased followed by diffusion. Also optical densities of *E. coli* plated adjacent to the center were near to zero, implying the copolymer HEMA–EDMA can serve as a porous material for molecular transport. Furthermore, plating each antibiotic at the center resulted in a distinct inhibitory level on *E. coli* growth along the distance from the center. For instance, carbenicillin was the strongest antibiotic that blocked any microbial growth over three row-distances from the center.

Molecular properties can correlate the antimicrobial activity on bacteria

To explain the differences in inhibitory level by antibiotics on *E. coli*, their molecular structures and chemical properties were compared to each other as shown in Figure 3-2(b) and Table 3.1. First, by comparing minimum inhibitory concentrations (MIC) to their actual values used for the experiment, it can be assumed that the amount of tetracycline was less severe than other antibiotics to impact the bacterial growth. Second, the partition coefficients were different between carbenicillin and kanamycin as well as their molecular structure, implying two antibiotics would have different binding affinities to the copolymer HEMA–EDMA. As hydroxethyl methacrylate (HEMA) harbors a hydrophilic pendent group it is likely that carbenicillin can bind better to the copolymer than kanamycin.

It should be noted that performing additional experiments can provide a better insight on the current growth measurements. Specifically, during the incubation with hydrogel devices bacterial cells are continuously exposed with antibiotic where its concentration can be estimated by each well location. In order to decouple the factors affecting the microbial growth in the current results, two experimental designs are suggested. First experiment is to measure diffusivity of antibiotic that pass through the hydrogel substrate. This will enable accurate modeling of concentration distribution across the wells in a device. Second experiment is to study growth response of bacteria by varying concentration of antibiotics under MIC. The relationship between the abundance and antimicrobial concentration (as similar to dose-response) can provide a more systematic understanding on the current results with hydrogel incubation.



Figure 3-2: (a) Growth measurements of *E. coli* after 6 h incubation in a hydrogel device treated with three different antibiotics. (b) Molecular structure of carbenicillin, tetracycline and kanamycin used in the experiment.

| | Carbenicillin | Tetracycline | Kanamycin |
|--|---------------|--------------|-----------|
| Molecular weight (g mol ^{-1}) | 378.4 | 444.435 | 484.5 |
| Concentration used (mg ml ^{-1}) | 50 | 5 | 25 |
| Minimum inhibitory | 9 | 1 | 1 |
| concentration (MIC) ($\mu g m l^{-1}$) | 2 | 1 | T |
| Partition coefficient | 1.13 | -1.3 | -6.3 |

Table 3.1: Chemical properties and concentrations of three antibiotics used in the experiment [5].

3.4 Communication between genetically engineered *E. coli* strains in hydrogel-based assay

After verifying that structured HEMA–EDMA can effectively control biomolecular diffusion that affects bacterial growth, it was further explored whether microbial interaction can occur via chemical diffusion under this hydrogel-based platform. In this section, co-culture experiments of two genetically engineered $E.\ coli$ strains are introduced, where an antimicrobial peptide was produced from one strain and inhibited a growth of another strain. The procedures were proposed and discussed in order to observe a clear communication between two bacterial strains under various co-culturing conditions in the hydrogel-based platform.

3.4.1 Materials and methods

Strains and device preparation

Three genetically engineered *E. coli* strain BL21 AMK75, BL21 AMK77 and K12 T9002 were provided by C. Vaiania (Voigt Lab) and Q. Wang. A "producer" strain BL21 AMK75 can generate microcin C which is a class of small antibacterial agent (< 10 kDa), and the growth of "indicator" strains, BL21 AMK77 and K12 T9002 is inhibited by microcin C [24]. All strains were genetically modified to express an amplicillin-resistant gene (Table 3.2). The cells were recovered from frozen glycerol stock by inoculating into liquid LB medium with carbeniciilin (50 µg ml⁻¹). The inocula were grown for 16 h at 37°C, 250 r.p.m.. Hydrogel devices were prepared as described in the Chapter 3.2.1 with liquid LB medium added with carbenicillin (50 µg ml⁻¹).

Experimental design

To explore whether two $E. \ coli$ strains can communicate each other via diffusion of microcin through the hydrogel, the assays were designed in a way to resemble an agar-based bacterial lawn method [36]. As summarized in Figure 3-3, the protocols

| | E. coli strain | Description | Source |
|-----------|----------------|-----------------------------------|-------------|
| Droducor | PL91 AMK75 | Ampicillin resistant, produces | C. Vaiania |
| 1 Iouucei | DL21 AMA75 | microcin C by expressing pAMK-164 | (Voigt Lab) |
| Indicator | BL21 AMK77 | Ampicillin registant | C. Vaiania |
| mulcator | | Amplemin resistant | (Voigt Lab) |
| Indicator | K12 T0002 | Ampicillin resistant | O Wang |
| mulcator | K12 19002 | (expresses pSB1A3) | g. wang |

Table 3.2: Bacterial strains used in the experiments.

were sequentially modified from the previous ones to optimize observation of strainto-strain communication. In all experiments, a control condition was designed by replacing plate strain BL21 AMK75 with BL21 AMK77 on the center well with the same initial cell density (row 5 column 6) as shown in Figure 3-3(b).



Figure 3-3: Schematic diagrams of hydrogel devices to co-culture producer and indicator strains. (a) A hexagonal design with the same dimensions as antibiotics diffusion assay (see Figure 3-1). Wells are outlined for which cultures were sampled to quantify the cell abundance. (b) A multiwell design compatible with using multichannel pipettes. Wells plated with producer strain are denoted with red color and indicator strain with beige color.

Incubation, sample collection and analysis

To incubate the hydrogel devices, bacterial cultures previously grown overnight were diluted at the rates listed in Table 3.3. After removing the LB medium from the devices 20 µl cells were plated in each well. Specifically, whereas in experiment 1 and 2 the strains were incubated simultaneously, in experiment 3 indicator strain was plated after incubating producer strain for 24 h to allow microcin C to diffuse

| No. | Geometry | Strains used | Dilution rate (P, I) | Incubation time (h) | Co-culture timing |
|-----|-----------|---------------------------------------|-------------------------|--|-------------------|
| 1 | Hexagonal | K12 T9002 BL21 AMK75 BL21 AMK77 | $5 \times 10^2, 10^6$ | 16 | Simultaneous |
| 2 | Multiwell | BL21 AMK75 BL21 AMK77 | $5 \times 10^2, 10^7$ | 16 | Simultaneous |
| 3 | Multiwell | BL21 AMK75 BL21 AMK77 | $10^3, 10^6$ | $\begin{array}{c} 24 \ (P) + \\ 6, 12 \ (I) \end{array}$ | Sequential |

Table 3.3: Experimental conditions for co-culturing $E. \ coli$ strains in hydrogel devices (P: producer strain, I: indicator strain).

throughout the wells.

After incubation the cultures were sampled to quantify the cell abundance from each well in the device. In experiment 1, each sample was diluted by 10 times (from 5 µl), 7 µl of cells was transferred to microcuvette (Agilent) and their abundance was measured by UV-vis spectrophotometer (Shimadzu) (600 nm wavelength). In experiment 2 and 3, 10 µl samples were diluted by 10 and 5 times respectively, transferred to 96-well plates and their abundances were measured by plate reader (Varioskan) (600 nm wavelength). The reads were plotted by visualizing with color using a customized MATLAB code (Mathworks) (Appendix B).

3.4.2 Results and discussion

Growth results of *E. coli* strains cultured in hexagonal and multiwell hydrogel devices are shown in Figure 3-4 and 3-5. As seen in the first two graphs in Figure 3-4, for test condition using strain BL21 AMK77 as an indicator a continuous increase of absorbance was observed as the wells are located farther away from the producer strain, whereas there was no clear tendancy of absorbance in control over the well locations. Specifically, for wells adjacent to the center (row 1) in all two replicating experiments, the absorbance reads were lower when the indicator strains were cocultured with producer strain, indicating the growth inhibition applied by *E. coli* strain BL21 AMK75.

While sampling and measuring cell abundances from hexagonal hydrogel devices,



Figure 3-4: Cell abundance measurements of indicator strain (BL21 AMK77, K12 T9002) in hexagonal hydrogel devices. Indicator strain is either co-cultured with BL21 AMK75 (test) or monocultured with BL21 AMK77 (control). Averages of 4 measurements are displayed with standard deviation. Experiments repeated twice with indicator strain BL21 AMK77 (first two graphs) and once with strain K12 T9002 (third graph).

a few technical limitations were observed which has led to design the device with multiwell geometry. First, there was a significant loss of culture volume due to evaporation during the 16 h incubation period, especially for wells located at the boundary on a device. Although the evaporation was inevitable due to a continuous exposure of the device to the air, it was explored whether the evaporation can be minimized by increasing the well volume. Second, the cell abundance measurements using microcuvette resulted in a high inaccuracy, because of a low sampling volume as well as an excessive time consumed to wash the microcuvette at every measurement. To circumvent these disadvantages a multiwell hydrogel device was devised to provide 1) easier steps for reading the absorbance using multichannel pipette and 96-well plate reader and 2) higher well volumes to minimize the culture loss by evaporation.

As expected, by using multiwell hydrogel devices compatible with multichannel pippettes, the measurement time was significantly reduced by reconstructing the information on cell abundance from every well with Matlab code (Figure 3-5, Appendix B). However, as a significant volume loss by evaporation was still observed for wells located at the boundary (Appendix C), the reads were excluded from the visualization. Another shortcoming on the multiwell design was that a few wells have been contaminated by droplets fallen from the container lid during the incubation period (Appendix C).



Figure 3-5: Visualization of cell abundances in multiwell hydrogel devices. Here BL21 AMK75 and BL21 AMK77 strains are used as a producer and indicator strain respectively. In each experiment, strains were co-cultured (a) simultaneously for 16 h, (b) sequentially for 6 h or (c) sequentially for 13 h.

In order to quantitatively compare the cell abundances between test and control conditions, the absorbance readings were plotted by the distance from the producer strain as shown in Figure 3-6. In experiment 2 where two strains were co-cultured simultaneously, a positive correlation is observed between the absorbance and the distance from the producer strain. This implies a gradient of microcin C concentration can be generated throughout the device during the bacterial growth. On the other hand, when indicator strain was sequentially plated after incubating producer strain for 24 h, it was only after 13 h of co-culture when the growth indicator strain started to be inhibited by the producer strain (Experiment 3, Figure 3-6(b)). The two growth measurements with different incubation period indicate that there may exist a critical timepoint on the growth phase of *E. coli* where the inhibitory effect by microcin C begins [24].



Figure 3-6: Absorbance readings using plate reader from multiwell-design hydrogel devices, plotted by the distance from the producer strain. Averages of 6 reads under the same distance are plotted with standard deviation. Two strains were incubated (a) simulataneously for 16 h in Experiment 2 or (b) sequentially for 6–13 h in Experiment 3.

3.5 Concluding remarks

In this chapter, a hydrogel-based platform was introduced for incubating microbial species exposed under diffusion of growth inhibitor throughout the device. In the first experiment using hydrogel devices as antibiotics diffusion assay, different antibiotics were tested how they can diffuse through the hydrogel wall to inhibit the growth of *E. coli*. In the second experiment two genetically engineered *E. coli* strains were co-cultured to see if they can communicate via diffusion of microcin C as an antimicrobial peptide. The two incubation experiments show that the structured copolymer HEMA–EDMA can be used as a promising material for incubating microbial species while systematically controlling the diffusion of biomolecules. Nonetheless, it remains

to be explored how the incubation protocol can be further optimized to prevent technical issues during the experiment such as evaporation.

Chapter 4

Hydrogel-based co-culture platform for studying bacterial communities with algal host

4.1 Background

Microbial interaction between algae and associated bacteria has been recognized as one of the major contributions to the ocean ecosystem [1] and biofuel production [9]. There is a growing evidence that the algal-bacterial interaction can occur in a diverse way such as direct cell-to-cell attachment [19, 30, 20, 22], chemotaxis [33, 34, 15] or exchange of biomolecules within a phycosphere [1, 32]. It has been shown that the community structure of bacteria can be uniquely shaped by the algal host [19, 20, 6] through these processes, although it still remains unclear why specific bacterial taxa can respond to the algal host during long-term co-cultivation.

One widely known factor on shaping the community structure of associated bacteria is metabolite diffusion of algal exudate, as in the oceanic environment most bacterial taxa can exploit nutrients via diffusion process [37]. However it has been challenging to assess the effect of diffusion process since the conventional batch coculture system does not provide to do so. In this chapter, a hydrogel-based platform is introduced as a tool to study how bacterial community structures are shaped by their location from the algal host. As similar to the previous chapter a spatially defined environment is given within the hydrogel device where algal exudate can reach out to the surrounding communities with different concentration.

4.2 Materials and Methods

4.2.1 Strains and culturing conditions

For algal species axenic *P. tricornutum* was obtained and its stock culture was maintained as described in Section 1.2.2. For bacterial communities, two types of culture were obtained from Lawrence Livermore National Laboratory (CA, USA) [19, 30]. In brief, bacterial filtrate was first generated from an outdoor sample by removing larger algal cells with 0.6–1 µm filter ("seawater communities"). Then enriched communities associated with algal phycosphere were generated after co-culturing the bacterial filtrate with *P. tricornutum*, then centrifuging to enrich bacterial cells that are attached to the surface of algal cells ("phycosphere enrichments"). Two bacterial community samples were maintained by co-culturing with *P. tricornutum* until being used for the experiment, under a batch condition at 20°C in a 12 h light/12 h dark diurnal cycle (200 µmol m⁻²s⁻¹).

4.2.2 Experimental design and preparation of hydrogel platform

In order to analyze bacterial community structure at different distances from the algal host, hydrogel devices were designed to allow incubation of an array of bacterial wells simulatneously, similar to the previous chapter as shown in figure 4-1. In detail, for incubating bacterial comunities three different distances from the center were designed in a hydrogel device. On the outmost layer, sterile f/2 medium was plated in order to prevent evaporation from the cultures during the incubation period. To see if there is a change in structure of bacterial communities by the presence of algal host, $\sim 1 \times 10^6$ cells ml⁻¹ of *P. tricornutum* was plated in the center well (test condition) and the results were compared to control condition where algal cells were not plated in the center well. Phycosphere enrichment samples were used as a bacterial community which were plated in the surrounding wells in the hexagonal array.



Figure 4-1: Schematic diagram of experimental setup for incubating *P. tricornutum* and bacterial communities in a hydrogel device. Bacterial cells are plated in surrounding wells located in a hexagonal array having three distances from the center. Algal cells (test) or f/2-Si medium without cells (control) is plated in the center well.

The hydrogel device was prepared as described in Chapter 2.2.1 with f/2 medium when immersing the devices in the jar for a week. The devices were taken out from the jar and placed onto incubating container (GasPak EZ container systems, BD) which was filled with f/2 medium to maintain the environment hydrated throughout the incubating period. All preparation steps were performed under sterile condition with a laminar flow hood to prevent any contamination. The container with hydrogel devices were incubated for one week, at 20°C in a 12 h light/12 h dark diurnal cycle (200 µmol m⁻²s⁻¹).

4.2.3 Sample collection, sequencing and analysis

After a week of incubation, 100 µl samples were collected by transferring into 96well filter plates. After washing the cells once with deionized water and removing any liquid media from the samples, the filter plate was stored in -20° C for further analysis. DNA was extracted from the frozen samples by heat lysing and a number of PCR cycles were performed accordingly. The PCR contained 140 µl of 5 prime mix, 1.4 µl of 100 µM forward 16S primer, 1.4 µl of 100 µM reverse 16S primer and 207.2 µl of DNA template. Cycling conditions were as follows: denaturation at 94°C for 3 min, followed by 35 cycles of denaturation at 94°C for 45 s, annealing at 51°C for 30 s and extension at 72° C for 1.5 min. The final extension was conducted at 72° C for 10 min and the samples were hold at 4°C. After amplifying 16S ribosomal RNA genes with PCR the samples were sequenced on an Illumina MiSeq. After retrieving ribosomal amplicon sequence variants (ASVs) the read pairs were trimmed, aligned using Muscle [14] and grouped into a tree with fasttree [29]. Sequences were analyzed by R using phyloseq package 1.30.0 [23]. Samples with total reads less than 100 were removed. Phyloseq 1.30.0 was used to perform Principle Coordinate Analysis (PCoA) and vegan 2.5.6 was used to perform permutational multivariate analysis of variance (PERMANOVA) [3].

4.3 Results and discussion

4.3.1 Bacterial communities are spatially affected by diffusion of algal exudates

After obtaining the ASV table of 16S rRNA gene, it was explored whether the community structure of bacterial samples can be affected by the presence of algal host. To do this, principle coordinate analysis was visualized on all samples including control and test conditions and their statistical difference was tested using PERMANOVA, as shown in Figure 4-2. With a significance p = 0.005, the hypothesis was rejected that the test and control conditions are similar to each other. Overall, the result suggests a proof of concept with the hydrogel platform to culture algae and bacterial community.



Figure 4-2: Principal coordinate analysis of bacterial community compositions under two incubating conditions (with or without algal host at the center well).

Next, it was further explored whether the bacterial community structures can be affected by the location of culture wells, specifically on the distance from the center (algal host). After grouping the samples by layer PERMANOVA test was performed to see whether there is a statistical difference between two incubating conditions (test and control) in each layer-based group. Interestingly, a statistical significance $(p \leq 0.005)$ on the difference between two conditions was observed for samples that were plated in wells in layers 1 and 3.

4.3.2 Individual bacterial taxa have unique growth dependency to algal host

After comparing community structures of bacteria that were co-cultured with algal host to the negative control, an abundance of each taxon was quantified to see which bacterial taxa were responsible for the potential difference in their structures. The relative abundance of each taxon was calculated by merging counts of each ASV under



Figure 4-3: Principal coordinate analysis of bacterial community compositions in each layer under two incubating conditions (with or without algal host at the center well). P values were measured from testing permutational multivariate analysis of variance with test and control samples. Asterisks denote statistical significance from the test at $p \leq 0.005$.

the same genus and dividing them to the total ASV counts of sample in each well. The mean relative abundances and standard deviations were calculated from 18 samples from the equal layer value and incubating condition (6 wells in a layer of device, 3 devices in total). As shown in Figure 4-4, three genera (*Algoriphagus, Oceanicaulis and Muricauda*) displayed a specific trend depending on the layer (distance from the center) and culturing conditions. In detail, they showed a relatively higher abundance in the layer 1 when co-cultured with algal host compared to the control; however, for the samples plated in layer 3 wells the genera showed an opposite trend. The results here imply that there exists a potential metabolic dependency of specific genera on *P. tricornutum* among the phycosphere-enriched communities.

4.4 Limitations and future work

Although the results suggest hydrogel devices can be used as a novel co-culture platform for metabolic communication between *P. tricornutum* and bacterial communities, the trends observed from the relative mean abundances are less convincing due to the large errors between replicates. Future work targets identification of a different approach to better interpret the current sequencing data with less error.



Figure 4-4: Mean relative abundance of bacterial communities plotted by genera. Values less than 0.5% were removed from the list.

Another limitation is the current incubating procedures for microbial cells in the hydrogel devices. To prevent evaporation during the incubation period, all devices were submerged in a f/2-Si medium and it allowed unwanted metabolite exchange between the devices. Specifically, this can affect the bacterial community structures under control condition (no algal cells at the center) by exposing them with algal exudates diffused from the test condition through the medium outside of the device. The incubating environment may be enhanced by using separate dishes between different condition to keep the devices hydrated without the cross-exchange of algal metabolites.

Appendix A

MATLAB code for counting the number of algal cells from microscope images

```
%% 11/1/18 Created by Hyungseok Kim (hskimm@mit.edu),
1
2
       %% 10/4/19 Modified, due to a change in img size (2048 px \leftrightarrow
            in 4X)
3
       clc; clear; close all;
4
       set(0,'DefaultAxesFontName', 'Calibri')
       set(0,'DefaultAxesFontSize', 15)
5
       set(0,'DefaultAxesfontWeight', 'normal')
6
7
       set(0,'DefaultTextFontName', 'Calibri')
8
       set(0,'DefaultTextFontSize', 15)
9
       set(0,'DefaultTextfontWeight', 'bold')
10
       fileloc = {'2019-09-21'};
11
12
       N = size(fileloc, 2);
13
       dens = zeros(N,6);
14
       vol = 0.4910e-3; % mL
15
       dil= 1;
16
17
       for t = 1:N
            cd('D:\Algae-bacteria\2019-09-19 Pt Ax,+ARW1R1,+\leftrightarrow
18
               ARW1Y1,+ARW7G5W (glass tubes)');
19
            cd(fileloc{t});
20
            for i = 1:3 % Replicate
21
                cnt = 0;
```

| $\begin{array}{cccccccccccccccccccccccccccccccccccc$ | 22 | | for j = 1:5 % Window sequence |
|---|----|-----|---|
| <pre>d_TxRed_4X_Dil%dx_%02d.jpg',i,dil,j)); 24</pre> | 23 | | A = imread(sprintf('Pt+ARW7G5W_R% \leftrightarrow |
| <pre>24</pre> | | | d_TxRed_4X_Dil%dx_%02d.jpg',i,dil,j)); |
| $\begin{array}{rcl} & & & & & & & & & & & & & & & & & & &$ | 24 | | if size(size(A),2) == 3 |
| 26 A2 = imbinarize(A2, 'global'); 27 else, A2 = imbinarize(A, 'global'); 28 end 29 [L,n] = bwlabel(A2); 30 cnt = cnt + n; 31 disp(n); 32 end 33 dens(t,i) = cnt/(vol*j)*dil(t); 34 end 35 end | 25 | | A2 = rgb2gray(A); |
| <pre>27 else, A2 = imbinarize(A,'global'); 28 end 29 [L,n] = bwlabel(A2); 30 cnt = cnt + n; 31 disp(n); 32 end 33 dens(t,i) = cnt/(vol*j)*dil(t); 34 end 35 end</pre> | 26 | | <pre>A2 = imbinarize(A2,'global');</pre> |
| <pre>28 end 29 [L,n] = bwlabel(A2); 30 cnt = cnt + n; 31 disp(n); 32 end 33 dens(t,i) = cnt/(vol*j)*dil(t); 34 end 35 end</pre> | 27 | | <pre>else, A2 = imbinarize(A,'global');</pre> |
| <pre>29 [L,n] = bwlabel(A2); 30 cnt = cnt + n; 31 disp(n); 32 end 33 dens(t,i) = cnt/(vol*j)*dil(t); 34 end 35 end</pre> | 28 | | end |
| <pre>30</pre> | 29 | | [L,n] = bwlabel(A2); |
| <pre>31 disp(n); 32 end 33 dens(t,i) = cnt/(vol*j)*dil(t); 34 end 35 end</pre> | 30 | | cnt = cnt + n; |
| <pre>32 end 33 dens(t,i) = cnt/(vol*j)*dil(t); 34 end 35 end</pre> | 31 | | disp(n); |
| <pre>33</pre> | 32 | | end |
| 34 end 35 end | 33 | | <pre>dens(t,i) = cnt/(vol*j)*dil(t);</pre> |
| 35 end | 34 | end | |
| | 35 | end | |

Appendix B

MATLAB code for visualizing absorbance reads from plate reader (hydrogel device multiwell design)

```
1
       %% 10/1/19 Created by HYUNGSEOK KIM (hskimm@mit.edu)
2
       clc; clear; close all;
       set(0,'DefaultAxesFontName', 'Calibri')
3
4
       set(0,'DefaultAxesFontSize', 15)
       set(0,'DefaultAxesfontWeight', 'normal')
5
       set(0,'DefaultTextFontName', 'Calibri')
6
7
       set(0,'DefaultTextFontSize', 20)
8
       set(0,'DefaultTextfontWeight', 'normal')
9
10
       1 = 8; % # rows
11
       b = 12; \% \# cols
       str = {'ctrl','test'};
12
       str2 = {'Control', 'Test'};
13
14
       hrs = [6, 13];
       cd('C:\Users\hskim\Desktop\LEMI\Co-polymer with Chris \leftrightarrow
15
          (2019 - 10 - 31 \_ AMK75 \& 77');
16
       rd = zeros(1,b,4); % 1-2 for 6 hrs, 3-4 for 13 hrs
       for i = 1:4
17
18
            stk = zeros(l,b);
19
            for run = 1:5
20
                raw = dlmread(sprintf('%dhrs_%s_%d.txt',hrs(ceil(↔
                   i/2)),...
```

```
21
                      str{1*(mod(i,2)==1)+2*(mod(i,2)==0)},run),'\t↔
                         ', [4 1 11 12]);
22
                 blk = mean(raw(1,:)); % blank media
23
                 raw = raw - blk; % offset by blank media
24
                 stk = stk + raw;
25
            end
26
            rd(:,:,i) = stk/run;
27
        end
28
29
        xhex = [0 \ 1 \ 2 \ 2 \ 1 \ 0]; \ \% \ x-coordinates of the vertices
        yhex = [2 3 2 1 0 1]; % y-coordinates of the vertices
30
31
        boxloc = [100 \ 100; \ 800 \ 100; \ 100 \ 600; \ 800 \ 600];
32
33
        % figure('Position', [100,100,800,950]);
34
        for j = 1:4
35
            figure('Position',[boxloc(j,:),700,250]);
36
        %
               subplot(2,1,j);
            C = rd(:,:,j);
37
38
            for i = 1:b % column
                 for k = 2:1-1 % row
39
40
                      patch((xhex+mod(k,2))+2*(i-1), yhex+2*(k-1) \leftrightarrow
41
                          C(l+1-k,6*mod(i+1,2)+ceil(i/2))); \ \% \leftarrow
                              includes the first column
42
        %
                        patch((xhex+mod(k,2))+2*(i-1), yhex+2*(k-1) \leftrightarrow
            , . . .
        %
                            C(l+1-k, 6*mod(i, 2)+floor(i/2)+1)); \ \ \leftrightarrow
43
           does not include the first column
                      hold on;
44
45
                 end
46
            end
47
        %
               patch((xhex+mod(4,2))+2*5,yhex+2*3,'w');
            title(sprintf('%dhrs, %s',hrs(ceil(j/2)),str2{1*(mod(\leftrightarrow
48
                j,2)==1)+2*(mod(j,2)==0)}));
49
            axis([-inf inf -inf inf]);
50
            set(gca,'YTickLabel',[]);
            set(gca,'XTickLabel',[]);
51
52
            caxis([0 0.5]);
53
            box on;
54
             colorbar;
55
             colormap(hot);
56
        end
```

Appendix C

Shortcomings in mutiwell hydrogel devices



Figure C-1: Schematic diagram displaying wells that were contaminated by droplets fallen by dewing in multilwell design of hydrogel devices, incubated for (a) 6 h and (b) 13 h.



Figure C-2: chematic diagram displaying wells that were dried out by evaporation in multilwell design of hydrogel devices, incubated for (a) 6 h and (b) 13 h.

Bibliography

- S. A. Amin, M. S. Parker, and E. V. Armbrust. Interactions between Diatoms and Bacteria. *Microbiology and Molecular Biology Reviews*, 76(3):667–684, sep 2012.
- [2] Shady a Amin, David H Green, Mark C Hart, Frithjof C K^opper, William G Sunda, and Carl J Carrano. Photolysis of iron siderophore chelates promotes bacterial algal mutualism. *Proceedings of the National Academy of Sciences*, 106(40):17071–17076, 2009.
- [3] Marti J. Anderson. A new method for non-parametric multivariate analysis of variance. *Austral Ecology*, 26(1):32–46, 2001.
- [4] Robert A. Anderson. *Algal culturing techniques*. Academic Press, 2005.
- [5] Jennifer M. Andrews. Determination of minimum inhibitory concentrations. Journal of Antimicrobial Chemotherapy, 48(suppl_1):5–16, jul 2001.
- [6] Gregory Behringer, Michael A. Ochsenkühn, Cong Fei, Jhamal Fanning, Julie A. Koester, and Shady A. Amin. Bacterial communities of diatoms display strong conservation across strains and time. *Frontiers in Microbiology*, 9(APR):1–15, 2018.
- [7] Michael A. Borowitzka. Commercial production of microalgae: ponds, tanks, and fermenters. In *Journal of Biotechnology*, volume 70, pages 313–321. 1999.
- [8] Chris Bowler, Andrew E. Allen, Jonathan H. Badger, Jane Grimwood, Kamel Jabbari, Alan Kuo, Uma Maheswari, Cindy Martens, Florian Maumus, Robert P. Otillar, Edda Rayko, Asaf Salamov, Klaas Vandepoele, Bank Beszteri, Ansgar Gruber, Marc Heijde, Michael Katinka, Thomas Mock, Klaus Valentin, Fréderic Verret, John A. Berges, Colin Brownlee, Jean Paul Cadoret, Anthony Chiovitti, Chang Jae Choi, Sacha Coesel, Alessandra De Martino, J. Chris Detter, Colleen Durkin, Angela Falciatore, Jérome Fournet, Miyoshi Haruta, Marie J.J. Huysman, Bethany D. Jenkins, Katerina Jiroutova, Richard E. Jorgensen, Yolaine Joubert, Aaron Kaplan, Nils Kröger, Peter G. Kroth, Julie La Roche, Erica Lindquist, Markus Lommer, Véronique Martin-Jézéquel, Pascal J. Lopez, Susan Lucas, Manuela Mangogna, Karen McGinnis, Linda K. Medlin, Anton Montsant,

Marie Pierre Oudot Le Secq, Carolyn Napoli, Miroslav Obornik, Micaela Schnitzler Parker, Jean Louis Petit, Betina M. Porcel, Nicole Poulsen, Matthew Robison, Leszek Rychlewski, Tatiana A. Rynearson, Jeremy Schmutz, Harris Shapiro, Magali Siaut, Michele Stanley, Michael R. Sussman, Alison R. Taylor, Assaf Vardi, Peter Von Dassow, Wim Vyverman, Anusuya Willis, Lucjan S. Wyrwicz, Daniel S. Rokhsar, Jean Weissenbach, E. Virginia Armbrust, Beverley R. Green, Yves Van De Peer, and Igor V. Grigoriev. The Phaeodactylum genome reveals the evolutionary history of diatom genomes. *Nature*, 456(7219):239–244, 2008.

- [9] Laura T. Carney and Todd W. Lane. Parasites in algae mass culture. *Frontiers* in Microbiology, 5(JUN):1–8, 2014.
- [10] Laura T. Carney, Joshua S. Wilkenfeld, Pam D. Lane, Owen D. Solberg, Zachary B. Fuqua, Nina G. Cornelius, Shaunette Gillespie, Kelly P. Williams, Tzachi M. Samocha, and Todd W. Lane. Pond Crash Forensics: Presumptive identification of pond crash agents by next generation sequencing in replicate raceway mass cultures of Nannochloropsis salina. *Algal Research*, 17:341–347, jul 2016.
- [11] Yusuf Chisti. Biodiesel from microalgae. Biotechnology Advances, 25(3):294–306, 2007.
- [12] J. Coupek, M. Krivakova, and S. Pokorny. New Hydrophilic Materias for Chromatography: Glycol Methacrylates. J Polym Sci, Part C, Polym Symp, 42(42):185–190, 1973.
- [13] Fayza Daboussi, Sophie Leduc, Alan Maréchal, Gwendoline Dubois, Valérie Guyot, Christophe Perez-Michaut, Alberto Amato, Angela Falciatore, Alexandre Juillerat, Marine Beurdeley, Daniel F. Voytas, Laurent Cavarec, and Philippe Duchateau. Genome engineering empowers the diatom Phaeodactylum tricornutum for biotechnology. *Nature Communications*, 5(May):1–7, 2014.
- [14] Robert C. Edgar. MUSCLE: Multiple sequence alignment with high accuracy and high throughput. Nucleic Acids Research, 32(5):1792–1797, 2004.
- [15] Anna Gaines, Miranda Ludovice, Jie Xu, Marc Zanghi, Richard J. Meinersmann, Mark Berrang, Wayne Daley, and Doug Britton. The dialogue between protozoa and bacteria in a microfluidic device. *PLoS ONE*, 14(10), 2019.
- [16] Zhifei Ge, Peter R. Girguis, and Cullen R. Buie. Nanoporous microscale microbial incubators. Lab on a Chip, 16(3):480–488, 2016.
- [17] Florian L. Geyer, Erica Ueda, Urban Liebel, Nicole Grau, and Pavel A. Levkin. Superhydrophobic-superhydrophilic micropatterning: Towards genome-on-achip cell microarrays. Angewandte Chemie - International Edition, 50(36):8424– 8427, aug 2011.

- [18] Jonghyun Ha and Ho-Young Kim. Capillarity in Soft Porous Solids. Annual Review of Fluid Mechanics, 52(1):263–284, 2020.
- [19] Jeffrey A. Kimbrel, Ty J. Samo, Christopher Ward, Daniel Nilson, Michael P. Thelen, Anthony Siccardi, Paul Zimba, Todd W. Lane, and Xavier Mayali. Host selection and stochastic effects influence bacterial community assembly on the microalgal phycosphere. *Algal Research*, 40:101489, jun 2019.
- [20] Ines Krohn-Molt, Malik Alawi, Konrad U. Förstner, Alena Wiegandt, Lia Burkhardt, Daniela Indenbirken, Melanie Thieß, Adam Grundhoff, Julia Kehr, Andreas Tholey, and Wolfgang R. Streit. Insights into Microalga and Bacteria Interactions of Selected Phycosphere Biofilms Using Metagenomic, Transcriptomic, and Proteomic Approaches. *Frontiers in Microbiology*, 8(OCT):1–14, oct 2017.
- [21] Pavel A. Levkin, Frantisek Svec, and Jean M.J. Fréchet. Porous polymer coatings: A versatile approach to superhydrophobic surfaces. Advanced Functional Materials, 19(12):1993–1998, 2009.
- [22] Xavier Mayali and Farooq Azam. Algicidal bacteria in the sea and their impact on algal blooms. *Journal of Eukaryotic Microbiology*, 51(2):139–144, mar 2004.
- [23] Paul J. McMurdie and Susan Holmes. Phyloseq: An R Package for Reproducible Interactive Analysis and Graphics of Microbiome Census Data. *PLoS ONE*, 8(4), 2013.
- [24] Anastasia Metlitskaya, Teymur Kazakov, Gaston H. Vondenhoff, Maria Novikova, Alexander Shashkov, Timofei Zatsepin, Ekaterina Semenova, Natalia Zaitseva, Vasily Ramensky, Arthur Van Aerschot, and Konstantin Severinov. Maturation of the translation inhibitor microcin. *Journal of Bacteriology*, 191(7):2380–2387, 2009.
- [25] Nils Meyer, Arite Bigalke, Anett Kaulfuß, and Georg Pohnert. Strategies and ecological roles of algicidal bacteria. *FEMS Microbiology Reviews*, 41(6):880–899, nov 2017.
- [26] Thomas J. Moutinho, John C. Panagides, Matthew B. Biggs, Gregory L. Medlock, Glynis L. Kolling, and Jason A. Papin. Novel co-culture plate enables growth dynamic-based assessment of contact-independent microbial interactions. *PLoS ONE*, 12(8):1–12, 2017.
- [27] D. Nichols, N. Cahoon, E. M. Trakhtenberg, L. Pham, A. Mehta, A. Belanger, T. Kanigan, K. Lewis, and S. S. Epstein. Use of ichip for high-throughput in situ cultivation of "uncultivable microbial species. *Applied and Environmental Microbiology*, 76(8):2445–2450, 2010.

- [28] Carsten Paul, Michaela A. Mausz, and Georg Pohnert. A coculturing/metabolomics approach to investigate chemically mediated interactions of planktonic organisms reveals influence of bacteria on diatom metabolism. *Metabolomics*, 9(2):349–359, 2013.
- [29] Morgan N. Price, Paramvir S. Dehal, and Adam P. Arkin. Fasttree: Computing large minimum evolution trees with profiles instead of a distance matrix. *Molecular Biology and Evolution*, 26(7):1641–1650, 2009.
- [30] Ty J. Samo, Jeffrey A. Kimbrel, Daniel J. Nilson, Jennifer Pett-Ridge, Peter K. Weber, and Xavier Mayali. Attachment between heterotrophic bacteria and microalgae influences symbiotic microscale interactions. *Environmental Microbiology*, 20(12):4385–4400, dec 2018.
- [31] Stuart A. Scott, Matthew P. Davey, John S. Dennis, Irmtraud Horst, Christopher J. Howe, David J. Lea-Smith, and Alison G. Smith. Biodiesel from algae: Challenges and prospects. *Current Opinion in Biotechnology*, 21(3):277–286, 2010.
- [32] Justin R. Seymour, Shady A. Amin, Jean Baptiste Raina, and Roman Stocker. Zooming in on the phycosphere: The ecological interface for phytoplanktonbacteria relationships. *Nature Microbiology*, 2:2–7, 2017.
- [33] Justin R. Seymour, Rafel Simó, Tanvir Ahmed, and Roman Stocker. Chemoattraction to dimethylsulfoniopropionate throughout the marine microbial food web. *Science*, 329(5989):342–345, jul 2010.
- [34] Steven Smriga, Vicente I. Fernandez, James G. Mitchell, and Roman Stocker. Chemotaxis toward phytoplankton drives organic matter partitioning among marine bacteria. Proceedings of the National Academy of Sciences of the United States of America, 113(6):1576–1581, 2016.
- [35] Mariane S. Thøgersen, Jette Melchiorsen, Colin Ingham, and Lone Gram. A Novel Microbial Culture Chamber Co-cultivation System to Study Algal-Bacteria Interactions Using Emiliania huxleyi and Phaeobacter inhibens as Model Organisms. *Frontiers in Microbiology*, 9(July):1–12, jul 2018.
- [36] Yanhan Wang, Sherwin Kuo, Muya Shu, Jinghua Yu, Stephen Huang, Ashley Dai, Aimee Two, Richard L. Gallo, and Chun Ming Huang. Staphylococcus epidermidis in the human skin microbiome mediates fermentation to inhibit the growth of Propionibacterium acnes: Implications of probiotics in acne vulgaris. Applied Microbiology and Biotechnology, 98(1):411–424, 2014.
- [37] Jonathan P. Zehr, Joshua S. Weitz, and Ian Joint. How microbes survive in the open ocean. *Science*, 357(6352):646–647, 2017.