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# Microbiome and Human Health: Current Understanding, Engineering, and Enabling Technologies

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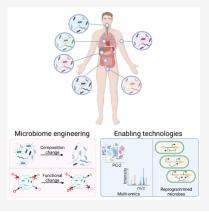


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ABSTRACT: The human microbiome is composed of a collection of dynamic microbial communities that inhabit various anatomical locations in the body. Accordingly, the coevolution of the microbiome with the host has resulted in these communities playing a profound role in promoting human health. Consequently, perturbations in the human microbiome can cause or exacerbate several diseases. In this Review, we present our current understanding of the relationship between human health and disease development, focusing on the microbiomes found across the digestive, respiratory, urinary, and reproductive systems as well as the skin. We further discuss various strategies by which the composition and function of the human microbiome can be modulated to exert a therapeutic effect on the host. Finally, we examine technologies such as multiomics approaches and cellular reprogramming of microbes that can enable significant advancements in microbiome research and engineering.



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### 1. INTRODUCTION

With advances that have enabled the sequencing of the whole genomes of organisms, we have since acquired an exponential amount of genome sequencing information from microbes. Over 130 000 complete or near-complete bacterial genomes have been sequenced. Meanwhile, there are more than 20 000 metagenomic projects publicly available, and many terabytes of sequencing data have been produced. This spectacular expansion of information regarding the genomic architecture of microbes has laid the foundation for truly revolutionary advances in our knowledge of microbial systems. We are now able to understand the interacting networks of biological molecules-including genes and proteins-at the systems level, and on the basis of this understanding, we can effectively engineer complex biological systems that perform desired functions. This technological advancement, along with the development of other key enabling techniques like gene synthesis, has contributed to the birth of the new interdisciplinary research field named synthetic biology.

However, microbes in the natural world are rarely found on their own; they invariably form a microbial community with each occupying a given niche. In addition, their habitats cover a wide range of abiotic and biotic environments. Through a long evolutionary cohabitation with the human body, this community of microbes, termed the microbiome, has established a profound role in its host's physiological functions such as metabolism, immune development, and behavioral responses (section 2). Due to the intricate relationship between microbial communities and the living host, unsurprisingly a disruption in one often results in the disruption of the other. That is, a disturbed microbiome—known as dysbiosis—can be observed in an array of the host's disease states, ranging from metabolic to immune and mood disorders. There has been a dramatic increase in human microbiome research and its association with different diseases in recent years. As the importance of the relationship between human-associated microbial communities and disease development becomes evident, there is a growing interest in engineering microbiomes to reshape and reprogram the composition and function of the gut microbiome as a novel therapeutic modality.

In general, modulating the function of the microbiome, or performing "microbiome engineering", can be achieved by altering the gut microbial composition or its metabolomic function (section 3). Such alterations are reported to be largely mediated by providing a specific microbe (or consortia of microorganisms), prebiotics, or bioactive metabolites to elicit a change in the composition and functions of the microbiome to correct the disrupted metabolic function. In addition, engineered probiotics or synthetic consortia of microbes can be used to provide a more rational and precise therapeutic intervention. Since the early days of engineering probiotics for such interventions, various genetic tools have been identified and developed for the more precise and complex execution of therapeutic activities (section 4).

The goal of this Review is to provide a comprehensive understanding of advances in the microbiome—host relationship for human health. Additionally, this Review aims to provide a nonexhaustive list of studies covering the manipulation of the human microbiome to prevent or treat human disease, with a special focus on multiomics approaches and the cellular reprogramming of microbes to enable in-depth microbiome research and robust microbiome engineering.

### 2. HUMAN MICROBIOME

Microbiome research has advanced rapidly over the past few decades and has now become a topic of great scientific and public interest. Historically, the field of microbiome research emerged from environmental microbiome research and later evolved into viewing eukaryotes as inseparable from the microbial community with which they share space. After all, the human body is an ecosystem where trillions of tiny organisms coexist with the host. The scientific term "microbiome" therefore refers to the set of genes of all microorganisms that inhabit almost all human body parts. The microbiome is thus considered as a second genome that has a symbiotic relationship with the host. This relationship may be positive or beneficial, negative or pathogenic, or neutral; hence, microbiome interactions play a key role in human health. The complex and diversified microbiome operates as a functional expansion of host genomes with an estimate of 50- to 100-fold more genes. These extra genes contribute to the regulation of host physiology by possessing various types of enzymatic proteins, influencing the produced metabolites and thus affecting host metabolism.

Over the years, instead of looking into the relationship between one specific microorganism with its host, a holistic approach based on the holobiont theory has been applied.<sup>2,3</sup> The beneficial interplay of the host and its microbiome is responsible for maintaining the host's health, whereas disease development is often correlated with microbial dysbiosis, or a shift in the microbiota. As such, pathogens therefore represent only a tiny fraction of microorganisms, whereby the altered composition of the microbiome promotes the emergence and outbreak of pathogens.<sup>2,3</sup> The vast majority of microbes are crucial for ecosystem functioning as well as beneficial interactions with other microbes, contributing to population dynamics and functional activities. Thus, opportunistic pathogens show that host—microbe interactions depend not only on the host but also on the entire microbiome.

The microbiota comprises all living members that form the microbiome, which encompasses bacteria, archaea, fungi, algae, and small protists. The members of microbiome also extend to viruses, phages, and mobile genetic elements—one of the most

controversial inclusions in the definition of a microbiome.<sup>4</sup> However, the microbiome has since been further defined to pertain to not only the community of microorganisms but also the whole spectrum of molecules produced by microorganisms, including their structural elements, metabolites, and molecules produced by the coexisting host.

Generally, microbial composition varies among different anatomical parts, and it is highly personalized as the microbiome's composition also varies among individuals. The exact definition of a healthy microbiota has yet to be defined, but studies have shown that the use of probiotics, prebiotics, and synbiotics are beneficial by maintaining healthy body flora or by altering the microbiome toward a healthy microbial ecosystem.

Therefore, defining the core microbiota is crucial as it facilitates the discrimination of an intermittent or temporal microbiome that is affected by specific environmental conditions. The core microbiota is the microbial community that is constantly associated with a given host genotype or a specific environment, whereas transient microbiota changes over time. By identifying these differences, an appropriate experimental, methodological, and statistical design can be applied to refine the approach taken in microbiome studies for therapeutic applications.

### 2.1. Factors Influencing the Human Microbiome

Microorganisms reside in their preferred environment depending on their optimal growth conditions. They can be found on the human body's external and internal parts as well as entrance sites. The external sites that house microorganisms include the skin, eyes, and even the exposed sites under the nails. The portals of entry for microorganisms are the respiratory tract (mouth and nose), gastrointestinal tract (oral cavity), urogenital tract, and breaks in the skin surface. Meanwhile, the internal parts of the body that are occupied by microbes include the lungs, gut, bladder, kidneys, and vagina.

Microbes tend to thrive in an environment that is suitable for them. Hence, these microorganisms are predicted to have mechanisms for adapting to conditions in the human microbiome that resemble their preferred natural environment. Environmental factors such as temperature, pH, oxygen concentration, pressure, osmolarity, and nutrient source contribute to the diversity and abundance of microorganisms at different sites of the body. For instance, our body temperature is optimal for housing many different types of microbes. Other factors, such as the presence of nutrient sources like sebum, change the skin's pH and also act as a carbon source, facilitating the growth of certain groups of microbes. Interestingly, the dense layer of mucus that covers the intestinal epithelium not only serves as a carbon source for microbes but also provides attachment sites for bacterial adhesion.

The abundance and diversity of the human microbiota is dependent on intrinsic and extrinsic factors. Intrinsic factors include the nature of body environments, as previously described, as the physiology of habitat sites facilitates the growth of some microbes. Other intrinsic factors that contribute to the microbiome's composition include genetics, ethnicity, gender, and age. The human microbiome is generally stable and resistant once the microorganism has adapted to the environment. On top of intrinsic factors that may cause a shift in the microbiome over time, extrinsic factors such as diet, lifestyle, medication, geographic location, climate, and seasonality may cause changes to the microbial community. Moreover, the mode of delivery during birth has been shown to influence the

microbiome. For example, newborns delivered via the vaginal versus Caesarean delivery possess different groups of dominating gut microbiome. However, at the age of 3, the gut microbiome changes to resemble that of the adult's gut microbiome.<sup>7</sup> As people reach beyond the age of 70, the ability to digest food and absorb nutrients in the gut changes, affecting the composition of the gut microbiome. With decreasing immune activity in older adults, this also contributes to changes in the overall microbiome as they are more susceptible to pathogens—thereby influencing the core microbiome. As Bifidobacterium spp. stimulates the immune system and metabolic processes, a decrease in Bifidobacteria may result in malnutrition and low systemic inflammatory status in older adults. 8 Altogether, the human microbiome thrives in optimal growth conditions, depending on the natural environment of the body. When the natural environment of the body is altered, this results in microbial composition and diversity shifting to adapt to the changing environment, potentially resulting in disease.

## 2.2. Microbiota in Different Body Parts and Its Relationship with Health/Disease

**2.2.1. Digestive System.** 2.2.1.1. Oral. The human oral cavity harbors one of the most versatile microbiomes, including bacteria, fungi, viruses, and protozoa, among others. There are two regions in the oral cavity colonized by microorganisms dentures, or the hard surfaces of the teeth, and the soft tissue of the oral mucosa. The main bacterial genera of oral cavities include Streptococcus, Granulicatella, Gemella, Actinomyces, Corynebacterium, Rothia, Veillonella, Fusobacterium, Prevotella, Porphyromonas, Capnocytophaga, Neisseria, Haemophilus, Treponema, Eikenella, Leptotrichia, Lactobacillus, Peptostreptococcus, Staphylococcus, Eubacterium, and Propionibacterium. Meanwhile, predominant fungal genera include Candida, Cladosporium, Saccharomyces, Fusarium, Aspergillus, and Cryptococcus. 10 Disease-related viruses such as mumps, rabies, and human papillomaviruses<sup>11</sup> are also found in the mouth, as well as protozoa such as Trichomonas tenax and Entamoeba gingivalis. 12

The oral cavity is the principal entry point to the human body, and thus, microbes residing in this area can potentially spread to different body sites and cause disease. The composition of the oral microbiome therefore plays a vital role in providing immunity for human health. For instance, nitrate metabolism by the microbiome reduces nitrate to nitrite. Nitrite is then converted to nitric oxide, which has an antimicrobial effect and is crucial for vascular health. Some oral microorganisms such as *Streptococcus salivarius* strain K12 contribute to host defense by creating an unfavorable environment that prevents the colonization of pathogenic bacteria. It produces a bacteriocin that restrains the growth of Gram-negative species associated with periodontitis disease.

The most prevalent oral disease is dental caries, commonly known as tooth decay. The bacteria involved in dental caries are *Streptococcus mutans, Streptococcus sobrinus*, and *Lactobacillus acidophilus*. Other species such as *Veillonella*, *Bifidobacterium*, *Propionibacterium*, *Actinomyces*, *Atopobium*, and *Scardovia* have also been found to be associated with dental caries. <sup>14,15</sup> Dental caries manifest when acid-producing bacteria residing in the oral cavity interact with the fermentable carbohydrate found in food. When the supragingival biofilm matures, it creates a low pH environment, demineralizing the tooth and eventually leading to cavitation. <sup>16–18</sup> Without adequate oral hygiene, certain microorganisms produce pathogenic characteristics, causing gingivitis. When this condition persists through chronic bacterial

infections, the subgingival plaque accumulation rearranges the microflora from a healthy to diseased state, affecting the gingiva and causing damage to the supporting connective tissue and the bone that fixes the teeth to the jaws. <sup>17,19,20</sup>

The oral microbiome has been recognized as a vital player in systemic health, with the disruption of the oral microbiome potentially contributing to several chronic diseases such as endocarditis, osteoporosis, and rheumatoid arthritis. <sup>21–23</sup> Oral health has also been found to play a role in the development and progression of noncommunicable diseases (NCDs) such as obesity, diabetes, cancers, <sup>24–26</sup> and neuropsychiatric disorders (NPDs). <sup>27–30</sup> Thus, it has been proposed that the oral microbiome could potentially be used to assess the risk for certain diseases. Similar to the widely studied gut microbiome, oral microbiome research is shifting to a holistic, systems-level understanding of its functions and interactions with the human body. <sup>31–33</sup> Future studies will likely shed light on how the oral microbiome can be restored to a healthy state.

2.2.1.2. Gastric. The stomach was previously believed to be a sterile organ due to its inhospitality to bacteria. Such factors include its acidic environment, reflux of bile acids, thickness of the mucus layer, and conversion of food to nitrite by Lactobacilli present in the oral cavity, which then transforms into the antimicrobial nitric oxide. However, the lack of simple and reliable diagnostic tests has hampered the study of the gastric microbiome.<sup>34,35</sup> With the discovery of Helicobacter pylori by Barry Marshall and Robin Warren in 1982, this notion has since been refuted. The most highly represented phyla in the gastric mucosa under normal conditions are Proteobacteria, Firmicutes (recently renamed to Bacillota<sup>36</sup>), Bacteroidetes (recently renamed to Bacteroidota<sup>36</sup>), Actinobacteria, and Fusobacteria. 37-39 The gastric juice has a diverse microbial community that differs from the gastric mucosa. The dominating phyla in gastric juice are Firmicutes, Actinobacteria, and Bacteroidetes, whereas Proteobacteria and Firmicutes are dominant in the gastric mucosa. 37,40,41 Furthermore, bacteria found in the oral cavity and duodenum such as Veillonella, Lactobacillus, and Clostridium can transiently colonize the stomach. 40,42

Unsurprisingly, *H. pylori* is the predominant bacterium in the stomach of *H. pylori*-infected patients, <sup>43</sup> and most *H. pylori* strains can modulate the gastric environment, thus altering the habitat of resident microorganisms. <sup>44</sup> Furthermore, alterations in the gastric microbiome community can increase the risk for developing gastric cancer. <sup>39</sup> It was also reported that eradicating *H. pylori* increased microbial diversity in the stomach. <sup>45</sup> Even though interactions between *H. pylori* and commensal bacteria in the stomach are not fully understood, the discovery of its direct effect on the healthy gastric microbiome may shed some light on ways to modulate the gastric microbiome to prevent progression to severe disease.

2.2.1.3. Intestines. The gut is the most densely and diversely colonized organ, with a bacterial-to-host cell ratio of 1:1. A vast majority of commensal bacteria reside in the colon, whereas a lower bacterial population is found in the stomach and small intestine. The main bacterial phyla present in the gut are Firmicutes and Bacteroides, which make up 90% of the gut microbiota. Other phyla that exist in the gut environment are Actinobacteria, Proteobacteria, Fusobacteria, and Verrucomicrobia. Notably, there are 200 different genera found under the Firmicutes phylum, with some examples including Bacillus, Lactobacillus, Enterococcus, Clostridium, and Ruminococcus. Although lactobacilli are beneficial to health, some Firmicutes species such as Staphylococcus aureus and Clostridium perfringens

are harmful to the body when overgrown. Meanwhile, the predominant genera in Bacteroidota are *Bacteroides* and *Prevotella*. The less abundant Actinobacteria phylum is largely represented by *Bifidobacterium*, and this genus is known to have a positive impact on health. Under the Proteobacteria phylum, some well-known pathogens include *Enterobacter*, *Helicobacter*, *Shigella*, *Salmonella*, and *Escherichia coli*.

The composition of the gut microbiota changes at three stages in life: from birth to weaning; from weaning to obtaining a normal diet; and finally, during old age. Facultative anaerobes are the first to colonize the gut at birth, and these bacteria create anaerobic conditions that promote the growth of obligate anaerobes, starting with Bifidobacterium and Bacteroides spp., within 2 weeks. 47 Infants born naturally are inoculated by the mother's vaginal and fecal microbiota during birth, whereas those born by Caesarean section are initially exposed to the skin microbiota as well as the microbiome found in the environment.<sup>48</sup> At 3 days, infants who were naturally delivered possessed a greater abundance and variety of Bifidobacterium spp. than the Caesarean-born babies. 49,50 Moreover, babies who were solely breastfed until weaning were observed to generally have a more stable and less diverse bacterial community, with higher proportions of bifidobacteria than babies fed by formula After being introduced to solid food, their gut microbiome diversified and the abundance of Firmicutes increased. 54-56 The microbiomes of breastfed and formula-fed babies become indistinguishable by around 18 months of age. By the age of 3, their microbiomes resemble that of an adult.<sup>7,5</sup> old age, there is reportedly a decline in microbiota diversity, with reduced numbers of Bifidobacteria and an increase in Enterobacteriaceae. 57,58 Likewise, the abundance of Bacteroidetes increases, whereas the Firmicutes becomes less abundant in elderly adults (>65 years).<sup>59</sup>

Apart from age, gut microbiome composition is also greatly influenced by the environment in different anatomical locations. The large intestine has slow flow rates, and the pH level ranges from mildly acidic to neutral. Thus far, it comprises the largest microbial community dominated by obligate anaerobes. The large intestine comprises several microenvironments wherein microorganisms reside. The epithelial surface and inner mucin layer harbors minimal colonization during the healthy state, whereas the diffuse mucin layer has specialist colonizers such as Akkermansia muciniphila. The liquid phase of the gut lumen comprises a diversity of microorganisms and specialized primary colonizers like *Ruminococcus* spp. depending upon the dietary fibers found in the gut lumen. <sup>60</sup> Given that the small intestine has a fairly short transit time of  $\sim 3-5$  h in digestion, the presence of high bile concentrations that possess antimicrobial activity<sup>61</sup> makes the small intestine a challenging environment for microbial colonizers. 61 Molecular analysis has revealed that the jejunal and ileal components comprise mainly facultative anaerobes, including the bacterial phyla Proteobacteria and Bacteroides and the Streptococci, Lactobacilli, and Enterococci species. 62,63

Gut bacteria are crucial for regulating digestion along the gastrointestinal tract. The commensal bacteria play a key role in processing nutrients and metabolites such as short-chain fatty acids (SCFAs), bile acids, amino acids, etc. <sup>64</sup> By doing so, some of these bacteria facilitate host energy harvesting and metabolic efficiency. <sup>65</sup> Some of these members also play an important immune function against pathogenic bacteria and prevent bacterial invasion by maintaining intestinal epithelium integrity. <sup>66</sup> Although the composition of the microbiome species

performs a key role in metabolism, the community's metabolic output is also dependent on the availability of substrates to the microbiota <sup>67,68</sup> or when extrinsic factors such as diet influence the gut microbiome. Microbe-synthesized metabolites potentially mediate crosstalk between the metabolic, immune, and neuroendocrine systems, thus governing host wellness. <sup>69</sup>

In addition to regulating digestion, dominant, nonpathogenic gut microorganisms occupy a specific niche, suppressing pathogenic colonization and growth. However, when the balance of the gut microbiome is perturbed, gut permeability increases. This change in permeability allows opportunistic pathogens to invade and colonize empty niches, changing the gut environment. This may lead to the production of dysregulated metabolites that are potentially harmful to the host, causing a range of diseases. Increased gut permeability also permits the entrance of microbe-derived products such as metabolites, virulence factors, and other luminal components, disrupting the gut microbiome's normal function and contributing to aberrant immune-inflammatory responses such as inflammation, allergy, and autoimmune disorders mediated by molecular mimicry and a dysregulated T cell response.<sup>70</sup>

Sometimes the source of the opportunistic pathogens comes from the resident site of the microbiome, and this occurs when the healthy nondisease state of the gut microbiome is disturbed, causing the failure of colonization resistance against the pathogenic member. An example is Clostridium difficile, which exists in the normal gut microbiota but becomes pathogenic when the healthy nondisease microbiome state is disrupted. C. difficile may damage the cytoskeleton and colonic epithelial barrier integrity, inducing aberrant inflammatory response and cell death.<sup>71</sup> C. difficile infection (CDI)-associated symptoms include diarrhea, pseudomembranous colitis, sepsis, and death.<sup>71</sup> It is proposed that the dominant gut microbiota in the healthy nondisease state confers protection to the host by preventing the overgrowth of C. difficile as it is often related to antibiotic-associated diarrhea compared to other pathogens such as Salmonella species. 72,73

Another commonly studied gut microbiome-associated disease is inflammatory bowel disease (IBD). It is a group idiopathic, chronic, and relapsing gastrointestinal inflammation with two common forms: ulcerative colitis (UC) and Crohn's disease (CD).<sup>74</sup> Inflammation occurs at any location along the entire GI tract in CD. Meanwhile in UC, inflammation is restricted to the large intestine. Both conditions are associated with recurring fever, diarrhea, and abdominal pain. It was suggested that dysbiosis in the gut potentially contributes to IBD pathogenesis.<sup>75</sup> An example is a reduction in the abundance of Firmicutes such as Faecalibacterium prausnitzii and Roseburia spp. 76-78 These are butyrate-producing bacteria, with butyrate being the primary energy substrate for colonocytes. Thus, a decrease in Firmicutes could heighten local inflammation by decreasing anti-inflammatory cytokines. 78,79 As such, F. prausnitzii has been explored as a probiotic for therapeutic use. 76

Aside from IBD, other intestinal disorders associated with the dysbiosis of the gut microbiota include irritable bowel syndrome (IBS), celiac disease, and colorectal cancer (CRC). A study of fecal samples from IBS patients exhibited a significant reduction in the concentration of *Lactobacillus* species as compared to healthy controls. Other studies have revealed that there is an increase in the ratio of Firmicutes to Bacteroidetes in IBS patients as compared to healthy individuals. There was also a decrease in some Firmicutes families such as *Lactobacilli* and *Faecalibacterium*, as well as *Bifidobacteria* and *Collinsella* under

the Actinobacteria population. In IBS patients, there was an increase in abundance in some Firmicutes families (*Veillonella, Streptococci*, and *Ruminococcus* spp.) and in Proteobacteria (*Enterobacteriaceae* spp.). These findings reveal that there is a loss of microbes associated with epithelial barrier function in IBS patients. <sup>81,82</sup> Although many diseases are hypothesized to have an association or correlation with the microbiome, some studies have also suggested the causation factors of the disease based on microbial activities. With this information, therapeutics advances can be developed.

Other microorganisms that live in the gut are viruses and bacteriophages that make up the vast majority of gut microbiota's viral components. Dominant archaeal species such as Methanosphaera stadtmanae and Methanobrevibacter smithii are also found in the gut microbiome.<sup>83</sup> Longitudinal studies of the gut have shown that specific species of an individual's microbiota are very stable and persist for a year or more. 84,85 The specific communities of human gut microbiomes are influenced by interindividual and intraindividual variation throughout the life cycle. Examples of some factors that affect variations in the microbiome include the intestine's anatomical regions, mode of delivery, method of milk feeding, weaning period, age, diet, and antibiotic treatments. The gut environment varies between different anatomical regions in terms of physiology, digesta flow rates, substrate availability, host secretions, pH, and oxygen tension.

2.2.2. Respiratory System (Nasal, Airway, and Lungs). 2.2.2.1. Nasal. The nasal cavity is an essential interface to the external environment. During inhalation, the airways are exposed to the environment, which comprises microorganisms, pollutants, aeroallergens, and more. A wide variety of potential pathogenic and harmless bacteria reside in the nose, and this diversity may be attributed to localized factors such as temperature and humidity. The position in the respiratory tract may also contribute to the diversity of the nasal microbiome. For instance, the anterior nares have decreased levels of microbiome biodiversity in comparison to the middle meatus and sphenoethmoidal recesses. The anterior nares are lined with keratinized squamous epithelium and sebaceous glands that produce sebum and may impact bacterial diversity.<sup>86</sup> However, a recent study did not detect any significant differences in bacterial diversity among the middle meatus, inferior turbinate, and anterior nares from healthy individuals, and thus, further studies may be required to obtain comparable

The microbiome of the anterior nares in healthy adults has been observed to be dominated by three phyla: Actinobacteria, Firmicutes, and Proteobacteria. 88 The anterior nares are further classified into four distinct genus profiles comprising Staphylococcus, Propionibacterium, Corynebacterium, or Moraxella.85 The middle meatus possesses a high abundance of Staphvlococcus aureus, Staphylococcus epidermidis, and Propionibacterium acnes. 90 The nasal microbiome in the unhealthy disease state has not been well-characterized, making further research necessary. Thus far, Staphylococcus aureus has been identified as one bacterial species that potentially functions in the development of the nasal disease chronic rhinosinusitis (CRS). Colonization of the nasal cavity and sinus with S. aureus may be associated with the presence of nasal polyps or disease severity in CRS. 91 An increased abundance of S. aureus has been observed in CRS participants with nasal polyps, compared to participants without the polyps. 90 With this preliminary information in hand, further studies on the clinical relevance

of the nasal microbiome in CRS and the functional role of *S. aureus* in CRS development should be explored in future research.

2.2.2.2. Pharynx, Larynx, and Trachea. The respiratory tract has long been thought to be sterile, largely due to the difficulty of culturing bacteria from the tract. However, microbes from the environment may first enter the upper tract (pharynx and larynx) followed by the lower tract (trachea) through the oral or nasal routes. As such, the upper respiratory tract has a greater abundance of bacteria compared to the lower region. 92,93 Given the current ease of sample collection, future respiratory tract microbiome studies may be explored further to obtain a consistent microbiome among healthy individuals. Nevertheless, studies have shown that healthy individuals have a lower abundance of Proteobacteria as compared to patients with mild asthma. 94 It was also reported that asymptomatic neonates whose throats are colonized with Streptococcus pneumoniae, Haemophilus influenzae, or Moraxella catarrhalis are at an increased risk for recurrent wheezing and asthma early in life.<sup>95</sup> These bacteria have consistently been associated with exacerbations of both asthma<sup>96</sup> and chronic obstructive pulmonary disease (COPD).97 So far, there are still limited studies on the respiratory tract microbiome, and further research is required.

2.2.2.3. Lungs. In many textbooks, it is commonly held that the lungs are normally sterile. However, during respiration, the lungs are continuously exposed to a wide range of environmental microbes. In the past, incompatible culture conditions have led to the absence of bacteria in respiratory specimens, supporting the misinterpretation that healthy lungs are free of bacteria. The invasive procedures involved in obtaining clinical samples also contributed to the delay in the systemic investigation of the lung microbiome. 98 While the most commonly used approach to study bacterial communities is via high-throughput sequencing of amplicons of the 16S rRNA gene, this technique presents technical challenges when bacteria with a low biomass are unable to mask any potential contaminants.<sup>98</sup> Healthy lungs contain a highly diverse interkingdom community of bacteria including Prevotella, Veillonella, Streptococcus, Haemophilus, Neisseria, and Corynebacteria. 99–101 In addition to these, many viruses such as Adenovirus, Rhinovirus, influenza, Epstein-Barr, and measles, among others, as well as fungi species (Aspergillus spp., Candida albicans, Candida immitis, Candida neoformans, etc.) are also associated with the respiratory tract.<sup>98</sup>

In every lung disease, the composition of the lung microbiome is altered compared to healthy controls. It is unknown if an altered lung microbiome drives the progression of lung disease or if it is a secondary consequence of the altered growth environment of the lungs. In some disease states, an increased airway wall permeability and mucus production introduces nutrient supply to the normally sparse lung environment. The mucus introduces pockets of increased temperature and decreased oxygen tension, selectively favoring the growth of disease-associated microbes. 102,103 In the event of enhanced immunogenicity, the airways and alveoli are exposed to pathogen-associated molecular patterns and microbial metabolites that provoke further inflammation, which in turn further alters airway conditions. 104 The generation of intraalveolar catecholamines and inflammatory cytokines promotes the growth of select bacterial species such as P. aeruginosa, S. pneumoniae, Staphylococcus aureus, and Burkholderia cepacia complex, whereas the recruitment and activation of inflammatory cells kills and clears bacteria with variable, species-specific effectiveness.  $^{105-108}$ 

It has been proposed that respiratory exacerbations are acute events of respiratory dysbiosis—that is, the disorder and dysregulation of the respiratory ecosystem—accompanied by a dysregulated host immune response, eliciting negative effects on the host. This is supported by a study that found that bacterial communities in the patients' airways shift away from Bacteroidetes—the most abundant phylum in healthy subjects—toward Proteobacteria and other disease-associated bacteria at the time of exacerbation. Exacerbations are activated by an inflammatory state that initiates a cascade of inflammatory responses that escalates the dysbiosis—inflammation cycle, and homeostasis is only restored after the disconnection of the positive feedback loop. Second

**2.2.3. Skin.** The skin is the largest and most exposed organ in the human body. Despite having plenty of transient interactions with the environment, the composition of the skin microbiota remains surprisingly stable. The diversity and relative abundance of the skin's microbiome varies among individuals and the physiology of the skin sites. Generally, the microbial community has been categorized into three broad groups: oily, moist, and dry. <sup>110</sup> In some cases, "feet" is separately categorized from the three broad groups because it has a distinct microbial signature and is in regular contact with the ground, constituting unstable microflora.

These characteristics create many possibilities for the skin to house numerous commensal bacteria, fungi, viruses, archaea, and mites. 110 They exist in different compositions and densities at various skin sites, and altogether these microorganisms are defined as the skin microbiome. The composition and abundance of microorganisms are dependent on the physiology of the skin site. For healthy adults, sebum-rich sites were dominated by lipophilic Cutibacterium (formerly Propionibacterium) species, whereas bacteria such as Staphylococcus and Corynebacterium species thrive in humid and moist areas such as the armpit, bends of the elbow, and feet. 112-115 In contrast to bacteria, the fungal community was not affected by the physiology of the skin. As such, the predominant fungi at the core body and arm sites are the genus Malassezia, while the feet's skin is colonized by a diverse community of Malassezia spp., Aspergillus spp., Cryptococcus spp., Rhodotorula spp., Epicoccum spp., and others. 115,116 Across skin sites, bacteria were more abundant compared to fungi; however, as there are less fungal reference genomes compared to bacteria, this may partly contribute to the difference in the abundance. <sup>110</sup> Unlike bacteria and fungi, the colonization of eukaryotic viruses is not dependent on the anatomical site. 117 Currently, studies on the interaction of the skin virome with the host and bacteriophages is limited and will benefit from future research. For instance, a study has revealed that a eukaryotic virus may cause a rare but aggressive form of skin cancer. 118 In contrast, bacterial and fungal communities found at sebum-rich areas were found to be the most stable, whereas those at the foot sites were the least. 117,119 This instability may be due to the transient presence of fungi in the environment. 110 Eukaryotic DNA viruses, on the other hand, varied the most over time. 117,119

The skin has comparatively less nutrients compared to the nutrient-rich environment of the intestines, with its available resources comprising sweat, sebum, and the stratum corneum. As such, this promotes *Propionibacterium acnes* to thrive in the anoxic sebaceous gland. This facultative anaerobe also utilizes proteases to obtain amino acids from

skin proteins, <sup>121</sup> as well as lipases to degrade triglycerides that retrieve free fatty acids, facilitating bacterial adherence. <sup>122–125</sup> In facial samples, the abundance of *Propionibacterium* spp. positively correlates with the cheek's sebum levels. <sup>126</sup> Interestingly, auxotrophic species such as *Malassezia* and *Corynebacterium* employ the lipids found in sebum and from the stratum corneum as they are unable to produce their own lipids for certain functional roles. <sup>120</sup> Thus, this may be one reason for the dominance of the *Malassezia* species in the adult skin mycobiome. <sup>110</sup> Likewise, *Staphylococcus* spp. harbors strategies for surviving on the skin, including halotolerance and utilizing urea found in sweat as a nitrogen source. <sup>120</sup> *Staphylococcus* spp. also produces proteases that retrieve nutrients from the stratum corneum and adherens that facilitate skin adhesion. <sup>120</sup>

Similar to the association of age with the gut microbiome, the skin microbiome is also significantly affected by age. During puberty, the increased level of hormones stimulates the sebaceous glands to produce additional sebum. This results in the skin of postpubescent individuals favoring the growth of lipophilic microorganisms such as Propionibacterium spp., Corynebacterium spp., 127 and fungal Malassezia spp. 128,129 On the other hand, prepubescent children have a higher abundance of Firmicutes (Streptococcaceae spp.), Bacteroidetes, and Proteobacteria (betaproteobacteria and gammaproteobacteria) as well as a more diverse fungal community. This reflects the association between one's age and the skin microbiome and, hence, relates to the tendency to develop certain diseases at different ages. For instance, in prepubescent children, cases of atopic dermatitis related to Staphylococcus dropped, whereas Malassezia-related tinea versicolor is more prominent in adults as compared to children. 130-132

To prevent colonization by pathogens, the skin's resident microbial members interact with each other. However, in some conditions, bacteria that were originally beneficial may exhibit pathogenicity associated with changes in the microbiota, otherwise known as dysbiosis. For example, the bacterium *P. acnes*, the most abundant microorganism present in the skin of healthy adults, is associated with the acne vulgaris commonly seen among teenagers. <sup>133</sup>, <sup>134</sup> Even though *P. acnes* is present in almost all adults, only a minority have acne issues, indicating that the gene expression profile varies at the functional level and that skin physiology—such as the level of sebum production and its secretion rate—correlates with the severity of clinical symptoms. <sup>135</sup>, <sup>136</sup> In addition, it was reported that the presence of *P. acnes* in the follicles and its formation of biofilms are associated with acne development. <sup>137</sup>

S. aureus is commonly cultured from the skin of individuals with atopic dermatitis (AD), <sup>138</sup> also known as eczema. There are factors supporting the hypothesis that the skin microbiome has an influential role in disease pathogenesis. In the event of AD flares, it was demonstrated that there is a decline in microbiome diversity and a dramatic increase in the abundance of S. aureus compared to the healthy or postflare state. <sup>139–141</sup> Additionally, the relative abundance of staphylococci advanced closely with the severity of the AD flare. Even though the correlation of S. aureus with AD during active disease exacerbation is known, the functional role of staphylococci in driving disease states is still poorly understood. Furthermore, it is also unknown if S. aureus contributes to disease initiation due to dysbiosis or if the changes in the microbial community are a consequence of the disease state.

**2.2.4. Urinary System.** The urinary bladder was traditionally considered sterile as any bacteria found in the bladder was

assumed to be pathogenic. However, with the discovery of the existence of nonpathogenic microbes in the human body, this notion has been abolished. 142 Due to advances in sampling and DNA sequencing techniques, commensal microbes have been identified in the urinary tract. 143 However, research on the urinary microbiome, or the urobiome, remains limited and understudied. In general, the abundance and diversity of the microbiome in the urine is lower compared to the gut by  $\sim 10^6$ 10<sup>7</sup> times. 144 The detection of the urobiome remains limited by the sampling method used. For example, some bladder mucosaassociated bacteria are undetectable in urine samples, and invasive methods are necessary for detection. The urobiome is similar for both genders, and the majority of the bacteria found belong to the phylum Firmicutes. Other phyla found in the urobiome are Actinobacteria, Bacteroidetes, and Proteobacteria. 145 Common genera for both genders are Escherichia, Enterococcus, Prevotella, Streptococcus, and Citrobacter. 146 Pseudomonas was detected only in males, whereas Corynebacterium and Streptococcus were more abundant in males compared to females. 146,147 On the other hand, the abundance of Lactobacillus was found to be higher in females compared to males. <sup>146,147</sup> Even though *Lactobacillus* is generally known as a probiotic, some species are associated with certain pathologies. For instance, Lactobacillus gasseri is associated with urgency urinary incontinence (UUI). 144 Moreover, a decrease in the abundance of Lactobacillus facilitates the colonization of diseasecausing uropathogens. 147 Gardnerella is second to Lactobacillus in terms of abundance among the urobiome in females. The most abundant species is Gardnerella vaginalis, with some pathogenic strains, causing urinary tract infections (UTIs) in women, which is comparatively less frequent in men. 144,148 In general, the dominant genera found in the female urinary microbiome are Atopobium, Citrobacter, Enterococcus, Escherichia, Gardnerella, Lactobacillus, Prevotella, Shigella, Sneathia, and Streptococcus, with the dominating species exclusive to healthy women being Lactobacillus crispatus, Gardnerella vaginalis, and Atopobium vaginae. 149 However, reports on the male urobiome are significantly fewer compared to the female urobiome, and the small sample size may hinder the identification of differences in the urobiome of both populations. 150 Finally, in healthy males, it is known that Staphylococcus haemolyticus is an abundant species. 151

The anatomical proximity and physiology of body sites influences the microbial community and their abundance. Unlike males, the proximities between the opening of the reproductive organ and the urinary tract are closer to each other in females. Thus, the vagina might be the main source of the microbial community in the urinary tract. In two studies, the existence of a common urogenital microbiota in both vaginal and urine samples was reported. 152,153 However, some differences were also observed. For instance, the genera Tepidimonas and Flavobacterium were found to be present in the urobiome, even though they are absent in the vaginal microbiome. 153 Other urobiomes such as the urinary fungal community have not been well-characterized, though the presence of Candida spp. has been reported in healthy individuals. 144 To date, only one species of archaea (Methanobrevibacter smithii) has been reported to be associated with urinary infection. 154 A urinary virome has also been detected, including lytic bacteriophages such as a Pseudomonas aeruginosa-infecting phage isolated from kidney stones<sup>155</sup> or Escherichia coli-infecting phages isolated from the bladder of females suffering from UUI. 15

Table 1. Predominant Microbiome Present on Different Body Sites and Their Relationship with Disease

body site	predominant microbes	microbiome-associated diseases
mouth	bacterial phyla: Actinobacteria, Bacteroidetes, Firmicutes, Fusobacteria, Proteobacteria, and Spirochaetes	dental caries (Streptococcus mutans, Streptococcus sobrinus, and Lactobacillus acidophilus) <sup>14,15</sup>
	fungal genera: Candida, Cladosporium, Saccharomycetales, Fusarium, Aspergillus, and Cryptococcus	periodontitis ( $Streptococcus salivarius may reduce the disease development)$ <sup>13</sup>
stomach	bacterial phyla: Proteobacteria, Firmicutes, Actinobacteria, Bacteroidetes, and Fusobacteria	gastric cancer (Helicobacter pylori) <sup>39</sup>
intestines	bacterial phyla: Firmicutes and Bacteroides	inflammatory bowel disease (lower abundance of Firmicutes) <sup>76–78</sup>
	archaeal species: Methanosphaera stadtmanae and Methanobrevibacter smithii	irritable bowel syndrome, celiac disease, and colorectal cancer (reduction in $Lactobacillus$ species) $^{80}$
nose	bacterial phyla: Actinobacteria, Firmicutes, and Proteobacteria	chronic rhinosinusitis (Staphylococcus aureus) <sup>91</sup>
airway and lungs	bacterial phyla: Firmicutes, Proteobacteria, and Bacteroidetes	asthma (lower abundance of Proteobacteria) <sup>94</sup>
	fungal species: Candida albicans, Ceriporia lacerata, Saccharomyces cerevisiae, and Penicillium brevicompactum	chronic obstructive pulmonary disease (Streptococcus pneumoniae, Haemophilus influenzae, or Moraxella catarrhalis) <sup>95</sup>
	viruses: Herpesviridae	
skin	bacterial phylum: Actinobacteria, Firmicutes, Bacteroidetes, and Proteobacteria	atopic dermatitis (Staphylococcus aureus) <sup>138</sup>
bladder	bacterial phylum: Firmicutes	urgency urinary incontinence (Lactobacillus gasseri) <sup>144</sup>
		urinary tract infection (Gardnerella vaginalis) 144,148
vagina	bacterial phylum: Firmicutes (Lactobacillus)	bacterial vaginosis, sexually transmitted infections (not dominated by $Lactobacillus$ ) $^{173,178-181}$

UTIs are one of the most common bacterial infections found in humans, especially among women due to the design of the female anatomy. UTIs have been commonly associated with *Escherichia coli*, but other commensal members are found in the gut microbiota, such as *Enterococcus* and *Staphylococcus*. <sup>157</sup> Interestingly, there seems to be a correlation between an increase in the intestinal abundance of these genera and a higher prevalence of UTI. <sup>158,159</sup> *E. coli* is also part of the commensal urobiome, and hence, it has been detected in healthy individuals. However, there are some differences in the motility genes between the isolates found in UTI patients and those in healthy individuals. <sup>160</sup> Moreover, *E. coli* has greater pathogenicity when it is isolated together with *Enterococcus*; however, the mechanisms underlying this coinfection are not yet well-understood. <sup>161,162</sup>

The vaginal microbiota may also impact the host's susceptibility to UTI. For instance, women with recurrent UTI become resistant if their vaginal microbiome is altered by the administration of probiotics, especially Lactobacillus crispatus. 163 Furthermore, women with bacterial vaginosis caused by the overgrowth of anaerobic species such as Gardnerella vaginalis suffer more UTIs than women with microbiomes composed mainly of Lactobacillus. 164 Studies have shown that temporary exposure to some strains of Gardnerella vaginalis triggers the activation of E. coli from dormant intracellular reservoirs in the bladder, enhancing the chance of developing recurrent UTI through the induction of apoptosis and interleukin 1-receptormediated injury in bladder epithelial cells. 165 These results extend the classic concept of UTI pathogenesis, suggesting that the disease may be driven by occasional exposures of the urinary tract to gut or vagina-associated bacteria that are not traditionally considered as uropathogenic.

**2.2.5. Reproductive System.** 2.2.5.1. Vaginal. The human vaginal microbiome differs from other body sites as it is dominated by a single genus, Lactobacillus. Because Lactobacillus spp. lower vaginal pH, they inhibit the growth of many pathogens and beneficially impact the host epithelium, modulating the immune system. 169–172 It was reported that  $\sim$ 25% of women in North America possess vaginal microbiomes that are not dominated by Lactobacillus. 173 Instead, their

microbiomes are composed of an even population of obligate and facultative anaerobes—namely, species in the genera *Gardnerella, Prevotella, Atopobium, Sneathia, Megasphaera,* and *Peptoniphilus.* <sup>166,168,173–175</sup> Interestingly, having such a vaginal microbiome correlates with the higher tendency of being diagnosed with bacterial vaginosis (BV), <sup>176,177</sup> a bacterial infection resulting from the imbalance of beneficial and harmful bacteria. Thus, epidemiological studies have associated microbiomes that are not dominated by *Lactobacillus* with an increased risk of acquiring sexually transmitted infections (STIs) <sup>178–181</sup> and preterm birth. <sup>182–186</sup> This also suggests that having a non-*Lactobacillus*-dominated community may be less protective toward developing adverse health outcomes. <sup>187</sup>

The vaginal epithelium is coated in a cervical mucus layer that is regulated by hormones. 188 The mucus is composed of protein, lipids, water, and glycoproteins, also referred to as mucins. 189 Mucins have been hypothesized to possess a protective role in the vaginal epithelium and may also serve as a nutrient source for the vaginal microbiome. 190–193 Mucin levels change throughout the menstrual cycle and similarly, the level of glycogen fluctuates throughout the cycle too. 194-196 Glycogen is produced by the vaginal epithelium, and epithelial cells consist of a high level of glycogen compared to other epithelial tissues. 197 Similar to mucin, glycogen is also thought to be a nutrient source for the vaginal microbiome. 198,199 The characteristics of vaginal physiology are influenced by hormonal changes. Therefore, during menopause, the levels of cervical mucus and glycogen decline, and the usual acidic environment of the vagina changes, contributing to the modified microenvironment for the vaginal microbiome. 200

Vaginal microbiota with a lower abundance of *Lactobacillus* and a higher proportion of facultative and obligate anaerobes such as *Gardnerella, Prevotella, Atopobium,* and *Sneathia* are associated with acquiring diseases like STIs and human immunodeficiency virus. <sup>178,201</sup> This vaginal microbiome profile has also been linked to both the incidence and prevalence of human papillomavirus. <sup>202,203</sup> Despite continuous research seeking to establish the association between vaginal microbiota and health, there is still insufficient information for connecting casual mechanisms and pathways. Nevertheless, an exploratory

study that used vaginal microbiota transplants (VMTs) has demonstrated long-term remission of women with recurrent bacterial vaginosis, <sup>204</sup> and such an approach may be employed in the future to gain insights into the modulation of the vaginal microbiome for therapeutic purposes.

### 2.3. Summary

In this section, we described how the large and diverse groups of microorganisms that reside in various parts of the human body (Table 1) have a highly coevolved relationship with human health. Microbiome research has highlighted the importance of human-microbiota ecosystems in the promotion of health and various disease-causing processes. This also suggests that the microbiome is a potential target for disease management. In the following section, we will present various strategies by which the composition and function of the microbiome can be modulated for therapeutic outcomes. With more studies revealing the mechanistic insights of the microbiome in relation to health, therapeutics applications can be refined.

# 3. STRATEGIES TO ENGINEER THE MICROBIOME FOR THERAPEUTIC APPLICATIONS

As described in section 2, the human microbiome plays a crucial role in health maintenance as it can influence the development of various diseases. This knowledge has led to the emergence of new therapeutic approaches that target both acute and chronic diseases by modulating the host microbiome. The rapid increase in the availability of robust, broad-spectrum, and easy-to-use synthetic biology tools (as discussed in section 4) has further contributed to unlocking the potential of engineering the microbiome to prevent and treat diseases.

In this section, we present different methods by which the human microbiome can be rationally engineered. We also discuss examples that demonstrate that microbiome engineering is a viable way to target diseases and enhance human health.

### 3.1. Changing the Population Dynamics of the Microbiome

The composition of the human microbiome is unique to every individual and is constantly fluctuating due to factors such as age, diet, host genetics, and medication. Nevertheless, distinct microbiome profiles have been associated with specific diseases by comparing the differences between patients and healthy controls. These differences can occur at any level of the taxonomic rank, with previous reports showing phylum-level to species-level associations. Several methods have been applied to correct microbiome differences with varying specificity and magnitude, as discussed later.

**3.1.1.** Increasing the Abundance of Specific Members of the Microbiome. A low microbial diversity of the human microbiome is significantly associated with several diseases. However, the changes observed in the microbiome composition might be dissimilar in different populations. For example, Dutch and Belgian cohorts showed a negative correlation between the Bacteroidetes enrichment and diversity, whereas a positive correlation was observed between Bacteroidetes and diversity in African individuals, underscoring the need for population-specific comparisons of the microbiome between healthy individuals and patients. The ratio of the two most dominant phyla in the microbiome, namely, Firmicutes/Bacteroidetes, is one of the most important parameters representing microbiome diversity, at least in the gut. Previous reports have shown a high ratio of Firmicutes/Bacteroidetes in obese Ukrainian adults compared to their lean counterparts. A similar observation was also made in Dutch<sup>210</sup> and Japanese<sup>211</sup> individuals with a

systematic review of 32 studies across varied populations, confirming the positive correlation between the Firmicutes/ Bacteroidetes ratio and obesity.<sup>212</sup> In contrast, a decreased Firmicutes/Bacteroidetes ratio has been observed in patients with inflammatory bowel disease (IBD). Manichanh et al. reported a significant reduction in the proportion of Firmicutes in the microbiome of patients with Crohn's disease (CD) compared to the healthy microbiome. 213 The alteration in the gut microbiome was also associated with disease activity and severity, with lower Firmicutes observed in patients with active ulcerative colitis (UC) compared to the inactive disease and in aggressive CD compared to the nonaggressive disease.<sup>214</sup> Firmicutes in the gut, particularly the genus Faecalibacterium, were also reduced in patients with major depressive disorder and bipolar disorder, 215 as well as chronic fatigue syndrome. 216 Apart from Firmicutes and Bacteroidetes, a lower abundance of other phyla in the gut, such as Actinobacteria, have also been associated with several diseases. Bifidobacterium is one of the most important genera belonging to the Actinobacteria, with lower counts of bifidobacteria found in celiac disease, 217 irritable bowel syndrome, <sup>218</sup> and Alzheimer's disease. <sup>219</sup>

The correlation between the decrease in microbiome diversity and disease development is not only limited to the gut; it has been observed in other anatomical locations as well. Kong et al. reported reduced skin microbiome diversity in patients with atopic dermatitis, with an enrichment of *Staphylococcus* sequences and depletion of Actinobacteria. In the lung, reduced microbial diversity and an abundance of Firmicutes was found to be significantly associated with the progression of idiopathic pulmonary fibrosis. The depletion of *Lactobacillus* spp., predominant members of the healthy urine microbiome in females, was observed in patients with UUI, a predisposition to UTI, 222 and overactive bladder.

3.1.1.1 Probiotic Supplementation. The studies mentioned earlier demonstrate that decreased levels of specific phyla or genera of microbes in the microbiome are significantly associated with disease development and progression. Therefore, engineering the microbiome to correct this imbalance is imperative to alleviate associated disorders and promote health. This can potentially be achieved by exogenously supplementing beneficial bacteria, such as probiotics, which can rebalance the microbiome. Such strategies have been evaluated previously and were found to be successful in some cases.

Joung et al. studied the effect of oral administration of L. plantarum K50 or L. rhamnosus GG to obese mice on a high-fat diet for 12 weeks.<sup>224</sup> At the end of the intervention, they showed that treated mice had reduced body weight and serum triglyceride levels as well as increased high-density lipoprotein cholesterol levels. A high Firmicutes/Bacteroidetes ratio was seen in nontreated obese mice, as seen in obese human individuals, which significantly reduced after treatment with the probiotic strains. <sup>224</sup> In another study, the administration of *L*. rhamnosus GG to mice on a high-fat diet led to the reversal of resistance to leptin (an appetite-regulating hormone), an increase in fecal microbiome diversity, and a reduction in the Proteobacteria phylum.<sup>225</sup> A meta-analysis of 15 clinical trials comprising a total of 957 participants concluded that probiotic intervention resulted in a significant reduction of body weight, fat percentage, and body mass index but not fat mass when compared to the placebo. 226 Although most clinical trials conducted did not perform microbiome analyses, changes in the composition of the fecal microbiome post-L. salivarius Ls-33 administration in obese adolescents were reported by Larsen et

al., with a significant decrease in the Firmicutes/Bacteroidetes ratio. However, the study did not find any changes in anthropometric and inflammatory parameters, making the correlation between changes in the gut microbiome and obesity ambiguous in humans.

Apart from the commonly used Lactobacillus and Bifidobacterium strains, Akkermansia muciniphila has found wide applications in treating cardiometabolic diseases, including obesity and diabetes. A. muciniphila is one of the most abundant species of the human gut microbiome; its depletion has been reported in obese and diabetic mice and, more importantly, in humans with pathologies such as obesity, type 2 diabetes, hypertension, and IBD. 229 Due to this clear negative correlation between A. muciniphila and cardiometabolic diseases, the safety and efficacy of A. muciniphila supplementation in counteracting obesity and diabetes was evaluated in a randomized, doubleblind, placebo-controlled study with 40 overweight or obese individuals.<sup>230</sup> It was observed that, compared to the placebo, both live and pasteurized A. muciniphila (10<sup>10</sup> CFU per day) were safe and tolerable for the study duration (3 months) with no reported adverse events. After 3 months, the group receiving pasteurized A. muciniphila showed improved insulin sensitivity as well as reduced cholesterol and body weight compared to the placebo. A reduction in the levels of markers for liver dysfunction was also seen in pasteurized A. muciniphila but not in the live microbe group. No change in the gut microbiome composition was seen in either of the groups. Strikingly, the pasteurization of A. muciniphila exacerbated its beneficial effects, raising interesting questions about the bacteria's mechanism of action. Although an outer membrane protein called Amuc 1100 was found to partly recapitulate A. muciniphila's beneficial effects, <sup>231</sup> further elucidation of the mechanism is warranted.

As for obesity, the administration of probiotics was evaluated for IBD management. Wang et al. showed that administering a mixture of L. plantarum ZDY2013 from acid beans and B. bifidum WBIN03 from infant feces to dextran sodium sulfate (DSS)-induced UC in mice led to the downregulation of the pro-inflammatory cytokines and upregulation of antioxidant factors.<sup>232</sup> Subsequently, the microbiome analysis of fecal samples from the mice revealed an increase in the abundance of unidentified Firmicutes and a decrease in Bacteroidetes. L. fermentum strains isolated from healthy individuals also demonstrated similar effects on the innate immune system in mice with DSS-induced colitis.  $^{233}$  The administration of L. fermentum KBL374 and KBL375 resulted in decreased levels of inflammatory cytokines and increased levels of the antiinflammatory interleukin (IL)-10. L. fermentum administration also reshaped the gut microbiome of mice by increasing the abundance of Lactobacillus and Akkermansia spp. and decreasing Bacteroides numbers.<sup>233</sup> Despite these reports of probiotics ameliorating IBD in mice, multiple clinical trial results have been discouraging. In a randomized, double-blind, placebo-controlled clinical trial comprising 142 patients with asymptomatic UC or CD, treatment with a multistrain probiotic cocktail showed no improvement in quality of life and other laboratory parameters, with a reduction in the fecal calprotectin levels of UC patients being the only significant finding.<sup>234</sup> Another clinical trial comprising 56 UC patients showed that administering B. longum 536 resulted in a significant decrease in the disease activity score after 8 weeks, but it was not statistically different from the placebo group at the end of the treatment. 235 Improvements in rectal bleeding and endoscopic score were observed in the probiotic group, but not in the placebo group. Moreover, the

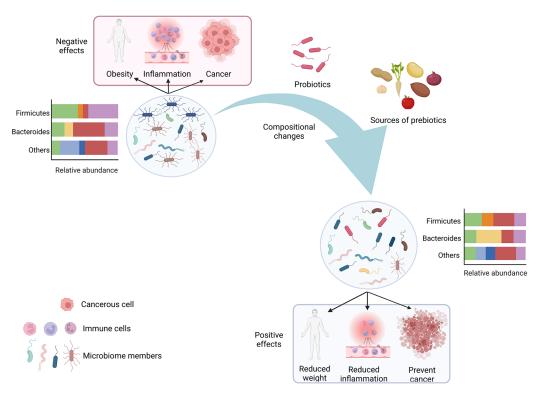
meta-analyses of clinical trials with UC and CD patients given probiotics concluded that probiotics are somewhat beneficial in UC, particularly in maintaining remission, but not in CD patients. This might be due to the insufficient period of treatment or delays in intervention. <sup>237</sup>

The bacterium F. prausnitzii, which belongs to the phylum Firmicutes, is a prominent member of the gut microbiome, accounting for 5% of total fecal bacteria. 238 A negative association between the abundance of F. prausnitzii and IBD has been confirmed by a meta-analysis of 16 studies encompassing 1700 CD or UC patients.<sup>239</sup> It was found that both CD and UC patients had a lower abundance of F. prausnitzii compared to healthy controls. Furthermore, patients with active CD and UC had reduced F. prausnitzii when compared to patients with CD and UC in remission, respectively. The importance of F. prausnitzii was further confirmed by in vivo studies in which the administration of bacteria to mice models of colitis led to reduced disease severity. <sup>240,241</sup> Surprisingly, no clinical trial involving the supplementation of this bacteria to IBD patients has been conducted yet, likely due to F. prausnitzii's extreme oxygen sensitivity, making it difficult to cultivate even in an anaerobic environment. 242

Few studies have evaluated changes in the fungal diversity and virome of patients with IBD. Sokol et al. reported a decrease in the levels of *Saccharomyces cerevisiae* and an increase in *Candida albicans* in IBD patients compared to healthy subjects.<sup>243</sup> *Malassezia restricta*, a common skin fungus, was also found in abundance in the gut of CD patients.<sup>244</sup> This fungus is known to elicit the release of inflammatory cytokines from innate immune cells, thus contributing to IBD development.<sup>244</sup> Similarly, the gut microbiome of UC and CD patients had a significant expansion of *Caudovirales* bacteriophages, which may contribute to intestinal inflammation.<sup>245</sup> Previous clinical trials have shown that *S. boulardii*, a closely related yeast to *S. cerevisiae*, can be used as an adjuvant therapy to induce remission or prevent the relapse of IBD in remission.<sup>246</sup> However, no clinical trial has evaluated *S. boulardii* as a standalone IBD treatment.

Atopic dermatitis (AD) is a common skin allergic condition associated with a dysbiotic skin microbiome with a higher abundance of S. aureus. Studies on culturable Gram-negative bacteria from the skin of AD patients and healthy individuals revealed that Roseomonas mucosa from healthy volunteers, and not AD patients, was associated with the amelioration of AD in a mice model.<sup>247</sup> On the basis of these results, a clinical trial comprising children below 7 years of age with AD (the most common group suffering from the disease) treated with R. mucosa isolated from healthy individuals was conducted.<sup>248</sup> Treatment with the commensal bacteria led to an improvement in the skin epithelial barrier function, lowered S. aureus burden, increased the skin's microbial diversity, and reduced the requirement of topical steroids for treatment. These positive effects were associated with the activation of the tissue-repair pathways by the glycerophospholipids produced by R. mucosa from healthy individuals, which were not produced by the isolates from AD patients.<sup>248</sup>

The alteration of vaginal flora has been shown to be associated with recurrent UTI, with the colonization of UTI-causing *E. coli* being derepressed due to the lower abundance of hydrogen peroxide-producing *Lactobacillus* in the vagina. <sup>249</sup> *L. crispatus* CTV-05 is a vaginal isolate that can produce hydrogen peroxide and adhere to the vaginal epithelial layer, <sup>250</sup> thus making it an ideal probiotic candidate for the treatment of recurrent UTI. In a



**Figure 1.** Modulation of microbiome composition by probiotics and prebiotics. A dysbiotic microbiome can contribute toward obesity development, inflammation, and cancer. Administering probiotics and prebiotics can change microbiome composition to ameliorate diseases.

randomized, placebo-controlled Phase 2 trial comprising 100 women with recurrent UTI, the patients were given a placebo or *L. crispatus* CTV-05 intravaginally for 10 weeks. Recurrent UTI occurred in only 15% of the patients receiving the probiotic treatment compared to 27% in the placebo group. High levels of vaginal *L. crispatus* were observed in both groups, suggesting the expansion of the endogenous *L. crispatus* population in the placebo group. However, it was not associated with significant therapeutic advantages, unlike the *L. crispatus* CTV-05 isolate, which is able to outcompete *E. coli* in the vagina. States

3.1.1.2. Prebiotic Supplementation. An alternative to the exogenous supplementation of probiotics is the administration of prebiotics, which are nondigestible substrates that can be utilized by members of the host-microbiome to confer health benefits. 252 Prebiotics are usually oligosaccharides that stimulate the growth of one or more species of bacteria already present in the microbiome. As different prebiotics can selectively increase the abundance of the microbes that can utilize them, these substrates can be used to remodel the microbiometransitioning it from a disease state to a relatively healthier state (Figure 1). Some common prebiotics are fructooligosaccharides (FOS) derived from inulins, galacto-oligosaccharides (GOS), xylo-oligosaccharides (XOS), and lactulose.<sup>253</sup> FOS, GOS, and XOS have been shown to promote Bifidobacterium expansion in the human gut, although there are conflicting reports of their effect on other bacterial genera due to differences in intervention doses and duration.<sup>25</sup>

In a prospective study on European newborn infants for the first 2 years of age, a gut microbiome analysis using stool samples was performed on infants with and without atopic dermatitis or other skin allergies. Lower counts of *Bifidobacterium* were observed in the first year of life in infants with allergies compared to healthy controls. A higher number of Clostridia at 3 months, higher *S. aureus* at 6 months, and lower *Bacteroides* at 12 months

were also observed. 257 An increase in Bifidobacterium levels after prebiotics administration to prevent atopic dermatitis was also evaluated in a randomized, prospective, placebo-controlled clinical trial comprising 259 infants receiving either 8 g/L of prebiotics (a mixture of GOS and FOS) or placebo. 258 It was observed that the group that received prebiotics showed a lower incidence of atopic dermatitis at 6 months of age compared to the group that received the placebo. This was accompanied by an increase in the levels of bifidobacteria, but not lactobacilli, as determined by the colony-forming units from the stool samples. Other microbes in stool samples were not analyzed. A similar reduction in the incidence of allergies was reported in infants receiving prebiotics until 2 years of age, although changes in microbiome composition were not determined.<sup>259</sup> The bifidogenic effect of FOS was also shown in adults with CD, wherein treatment with 15 g of FOS for 3 weeks led to an improvement in disease activity, an increase in the fecal bifidobacteria, and the modification of mucosal dendritic cell functions, such as increased IL-10 expression.<sup>260</sup>

The modulation of the gut microbiome by prebiotics also has applications in cancer therapy. In a study by Han et al., the administration of a colon-retentive inulin gel to a mice model of colorectal cancer improved the antitumor efficacy of the immune checkpoint blocker, antiprogrammed cell death protein-1 ( $\alpha$ -PD-1). Previous studies have shown that patients that respond to immune checkpoint blockers have a higher abundance of beneficial bacteria, such as *Bifidobacterium*, *Akkermansia*, Ruminococcaceae, and *Faecalibacterium* in their gut microbiome compared to nonresponsive patients. Han et al. showed that the oral administration of the inulin gel to the mice led to the expansion of such beneficial bacteria, including *Akkermansia*, *Lactobacillus*, and *Roseburia*. This elicited a T cell response in the mice that worked in synergy with  $\alpha$ -PD-1 for an enhanced antitumor effect. <sup>261</sup>

3.1.2. Depletion of Specific Members of the Microbiome. Contrary to increasing the abundance of specific microbes in the microbiome, the selective depletion of certain members is another viable way of engineering the microbiome, particularly during infections. Since the discovery of penicillin in 1928, antibiotics have been the primary mode of defense against pathogens. However, most antibiotics currently in use are nonspecific in their antimicrobial activity and, consequently, cause a significant decrease in the diversity and richness of the human microbiome. Dethlefsen and Relman showed that there was a rapid shift in the composition and loss of diversity in the gut microbiome of individuals within 3-4 days after administration of ciprofloxacin. 265 Although some members of the gut microbiome recovered after the end of the antibiotic course, recovery was incomplete, and the final composition was altered compared to the initial state. The altered composition of the microbiome due to antibiotics is also associated with increased susceptibility to other pathogens, immune dysregulation, and the rise of resistance genes. 266,267 To negate the negative impact of antibiotics on the microbiome, targeted therapies against pathogens are required. Some small-molecule antibiotics are in clinical development and show promise against specific pathogens. For example, ridinilazole is a DNA-binding small molecule with highly targeted action against Clostridium difficile.<sup>268</sup> In a Phase II randomized, double-blind clinical trial, ridinilazole was found to provide a superior clinical cure with no infection recurrence, compared to the current standard-of-care vancomycin.<sup>269</sup> This was accompanied by a less disrupted microbiome in the case of ridinilazole. Vancomycin treatment led to a significant reduction of Firmicutes, Bacteroidetes, and Actinobacteria and the expansion of Proteobacteria, whereas ridinilazole showed only a modest reduction of the Firmicutes.<sup>270</sup> Similarly, targeted antibiotics against the skin pathogen S. aureus, pneumonia-causing P. aeruginosa, and Enterobacteriaceae are also in development.<sup>27</sup>

In addition to the collateral damage to the microbiome, broad-spectrum antibiotics may also suffer from poor efficacy, such as in biofilms in which the pathogens remain impervious to the antibiotics. This is exemplified in the case of bacterial vaginosis, which is characterized by the displacement of beneficial Lactobacillus spp. with anaerobic bacteria, predominantly Gardnerella vaginalis, which forms a biofilm on the vaginal epithelium.<sup>272°</sup> Broad-spectrum antimicrobials have shown high short-term curing rates but are unable to prevent the recurrence of vaginosis, partly due to biofilm formation.<sup>273</sup> Landlinger et al. developed a narrow-spectrum engineered endolysin, a peptidoglycan-degrading enzyme, by identifying and performing domain shuffling on 14 native endolysins present in Gardnerella.<sup>274</sup> Among the various candidates, PM-447 was selected based on its high antimicrobial activity against various Gardnerella spp. and negligible activity against Lactobacillus spp. and other vaginal microbes. Interestingly, PM-447 was also able to target Gardnerella in vaginal samples from 13 patients with bacterial vaginosis and disperse the biofilm without affecting the remaining vaginal microbiome. 274 Further evaluation of PM-447 in animal models is still awaited.

Vaccines also have the potential to eliminate pathogens in the human microbiome to prevent diseases. For example, the pneumococcal conjugate vaccine (PCV-7) against *Streptococcus pneumoniae* has significantly decreased the prevalence of invasive pneumococcal disease, particularly in young children. <sup>275</sup> PCV-7 was designed against the seven virulent serotypes of *S. pneumoniae*, a natural colonizer of the upper respiratory tract.

However, studies have shown that the niche vacated by virulent serotypes of the bacteria after vaccination was occupied by nonvaccine serotypes. Furthermore, an increase in the abundance of *S. aureus*, an ecological competitor of *S. pneumoniae*, was also observed.<sup>276,277</sup> The use of a broader PCV-13 vaccine was found to increase the diversity and stability of the nasal microbiome,<sup>278</sup> likely due to the opening of a larger niche that was occupied by nonpneumococcal bacteria.<sup>279</sup>

As an alternative to antibiotics and vaccines, bacteriophages have also been used as natural predators that target pathogenic bacteria and their associated diseases. The main advantage of using phages is their narrow host range, enabling precise elimination of the pathogen. Phages specific against *S. aureus, Enterococcus faecium, Vibrio parahaemolyticus, Acinetobacter baumannii*, and *Mycobacterium tuberculosis* have been previously isolated and found to be effective in targeting even antibiotic-resistant variants of the pathogens, at least in in vitro and in vivo models. <sup>281</sup>

Beyond infections, bacteriophages have also been used as therapies against other disorders by modulating the microbiome. Duan et al. showed that patients with alcoholic hepatitis have a higher number of fecal *E. faecalis* compared to nonalcoholic individuals or patients with other alcohol-use disorders. The authors identified cytolysin, an exotoxin produced by *E. faecalis* in the gut, to be responsible for liver injury. Upon administration of a bacteriophage targeting *E. faecalis* in mice inoculated with bacteria from patients with alcoholic hepatitis, a significant decrease in cytolysin levels was observed, accompanied by reduced liver injury. The fecal count of *Enterococcus* was also reduced, but no significant change in the microbiome composition was observed, indicating the targeted elimination of *E. faecalis*. <sup>282</sup>

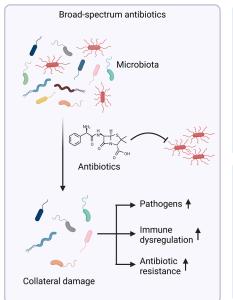
In another study, Zheng et al. used a phage isolated from human saliva against the pro-tumoral Fusobacterium nucleatum to develop a novel therapy for colorectal cancer (CRC). Previous studies have shown that a high proliferation of F. nucleatum causes chemoresistance in CRC. Therefore, by using a phage targeting F. nucleatum in combination with nanoparticles loaded with a chemotherapy drug, the authors demonstrated superior efficacy of this method in different CRC mice models, compared to the chemotherapy drug alone or an antibiotic cocktail. A significant reduction of F. nucleatum and an increase in the abundance of antitumoral SCFA-producing bacteria were also seen in the gut of the mice.

Bacteriophages have also been used to treat acne vulgaris, one of the most common dermatological disorders worldwide. One contributing factor to the development of the disease is the higher abundance of *Propionibacterium acnes*, although the exact mechanism is still debatable. To reduce the number of *P. acnes*, Brown et al. formulated an aqueous cream comprising a cocktail of bacteriophages isolated from human skin microflora against *P. acnes*. The cream was found to be effective in lysing *P. acnes* in vitro but has yet to be evaluated in animal models.

Engineered bacteria, both commensal and probiotic, are also emerging as robust therapies for targeted pathogen eradication. Although probiotic bacterial strains are known to prevent infection through the competitive exclusion of the pathogen and native production of antimicrobial agents, these strategies often show poor clinical efficacy. With the aid of synthetic biology, novel functionalities can be incorporated into the bacteria of choice to enable highly efficient and selective pathogen elimination. This is achievable due to the integration of biosensors in the bacteria that detect quorum signaling

Non-specific depletion

Specific depletion



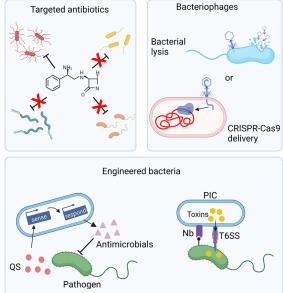


Figure 2. Strategies to deplete members of the microbiome. Nonspecific depletion can be mediated by broad-spectrum antibiotics. Specific depletion can be achieved by targeted antibiotics, bacteriophages, and engineered bacteria. QS, quorum signaling; PICs, programmed inhibitor cells; Nb, nanobody; T6SS, type-6 secretion system.

molecules produced by the target pathogen, such as acyl homoserine lactone (AHL) by P. aeruginosa<sup>288</sup> and autoinducing peptides (AIP) by S. aureus, 289 which in turn activates the production and secretion of an antibacterial agent. Due to the high species specificity of quorum signaling molecules, the precise delivery of the therapeutic molecule becomes feasible potentiating the use of engineered bacteria as viable alternative therapies for infections. Such strategies have been previously used to target P. aeruginosa, 288 S. aureus, 289 and V. cholerae. 290 Although these studies demonstrated the efficacy of the engineered bacteria in eliminating the target pathogen in either in vitro or in vivo models, the extent to which the microbiome is perturbed due to the administration of the engineered bacteria was not evaluated. Depending upon the chassis used, the engineered bacteria might rapidly transit through the microbiome or persist for a prolonged period. Although the former is unlikely to significantly alter the composition of the microbiome due to its inherent resistance to change, <sup>291</sup> the latter might have a considerable impact, and future studies designed to evaluate this will have to be conducted.

In addition to the engineered bacteria, synthetic biology has also been used to engineer bacteriophages, repurposing them as antimicrobial delivery vehicles. Various studies have engineered bacteriophages to deliver CRISPR-Cas9 systems into their host. <sup>292–294</sup> The CRISPR-Cas9 system is designed such that it recognizes a gene in the genome of the host, upon which it introduces double-stranded breaks in the genome, resulting in cell death. This approach is more specific compared to the use of wild-type bacteriophages because CRISPR-Cas9 is unable to induce cell death in the absence of the target gene. This strategy also enables the selective elimination of bacteria carrying antibiotic-resistance genes by programming CRISPR-Cas9 to identify these targets. <sup>293</sup> However, the escape of target bacteria from the killing activity of CRISPR-Cas9 is a major drawback for

this method, and escapees, either by chromosomal deletions or loss of CRISPR arrays, have been reported previously.<sup>294</sup>

To improve upon these drawbacks, Ting et al. devised a novel strategy for targeted bacterial depletion by programmed inhibitor cells (PICs), which are engineered bacteria carrying the type-6 secretion system (T6SS) with a nanobody displayed on the surface (Figure 2).  $^{295}$  The nanobody recognizes an antigen on the surface of Gram-negative bacteria, such as outermembrane proteins BamA and intimin, enabling cell-cell adhesion. T6SS is an antagonistic system through which the engineered bacteria can deliver antibacterial toxins into the target bacterial cell. The engineered bacteria protect themselves from the toxins by expressing immunity proteins. Due to the fluidic nature of the gut environment, T6SS alone is likely to be inefficient in delivering the toxins. Thus, the authors incorporated the nanobody into the bacteria for enhanced antibacterial activity.<sup>295</sup> The authors showed that an intiminexpressing E. coli spiked into the fecal samples from mice was successfully depleted by 90% by using an engineered Enterobacter cloacae expressing an anti-intimin antibody on the surface with a native T6SS. This depletion was highly specific as an *E. coli* strain expressing partial intimin was unaltered. Analysis of the other bacteria in the fecal samples revealed only minor changes in microbiome composition, indicating the potential of PICs to be used as highly specific antimicrobials.

### 3.2. Changing the Functionality of the Microbiome

The previous section describes how microbiome composition is important in understanding its association with disease development and how it can be subsequently modulated for disease treatment. However, perhaps even more crucial than composition in understanding the influence that the microbiome exerts on its host is the microbiome's function, corresponding to the active genes, proteins, and metabolites produced by its members. The significance of microbiome function stems from the likelihood that microbiomes with

different compositions might still exhibit similar functions due to functional redundancy. This was observed in a study on the gut microbiome of obese and lean female twins that shared >93% of functional genes, comprising a core microbiome, despite having limited similarity at the phyla level. A similar relative abundance of microbial clades associated with clinically varied diseases also suggests that the function of the microbiome, and not its composition, has a stronger influence and association with human health. <sup>297</sup>

Morgan et al. demonstrated the importance of studying microbiome function in their study of microbiome samples from 231 IBD patients and healthy individuals, which were analyzed by 16S RNA sequencing and metagenomics. 298 In addition to the expected changes in microbiome composition, there was a more consistent shift in microbial functions, such as decreased carbohydrate metabolism and amino acid biosynthesis, as well as increased nutrient transport and uptake. Similarly, the enrichment of lipopolysaccharide biosynthesis, pathogenic processes, and inflammatory pathways and the depletion of amino acids and energy metabolism have been reported in patients infected with HIV on antiretroviral therapy. 299 To elucidate the exact mechanism by which microbiome function influences host health, multiomics studies beyond metagenomics are needed. These include transcriptomics, proteomics, and metabolomics to characterize the microbiome at the functional level in both healthy and diseased states. Although there are limited examples of such studies, some rationally designed interventions for modulating microbiome function have been reported before and are discussed later.

3.2.1. DNA Conjugation-Mediated Engineering. DNA conjugation is a method of in situ engineering of the microbiome by delivering a genetic payload to the target microbe via a donor bacterium. These payloads can be mobile genetic elements carrying genes to incorporate novel functionalities into the target bacteria. Such an engineering approach is advantageous because this enables the modification of even unculturable bacteria with complex phenotypes that may not be adequately replicated in non-native bacterial strains. 300 In a study by Brophy et al., the authors used a B. subtilis strain to transfer a miniaturized integrative and conjugative element (mini-ICEBs1) efficiently to various Gram-positive bacteria isolated from the human skin and gut microbiome. 301 The conjugative transfer was placed under the control of an inducible promoter, and the genes that enable further propagation of the ICEBs1 beyond the initial recipient were deleted as a safety feature. Because new donor strains carrying the DNA to be transferred can be created with ease, this strategy will be useful in rapidly engineering microbiomes with synthetic programs and modulating their function.

Another DNA conjugation strategy was developed by Ronda et al. wherein an *E. coli* donor strain was engineered to transfer mobile plasmids, either replicative or integrative, into recipient Gram-positive and Gram-negative strains.<sup>302</sup> The authors demonstrated that this method can be applied to engineer the microbiome by using the donor *E. coli* to deliver green fluorescent protein (GFP) into members of the gut microbiome in mice. By using a library of mobile plasmids, up to 5% of the bacteria were found to receive the plasmid 6 h postadministration of *E. coli*. The recipients belonged to all four major phyla in the gut microbiome, namely, Firmicutes, Bacteroides, Actinobacteria, and Proteobacteria.<sup>302</sup> Interestingly, the transconjugants persisted only for 72 h postadministration of the *E. coli* donor, suggesting unstable plasmid maintenance.

Jin et al. developed a genetic manipulation pipeline through which they were able to genetically modify 27 of the nonmodal bacteria belonging to the Firmicutes/Clostridia class. The authors identified the culture conditions that can support bacterial growth followed by a library of genetic tools, including the origin of replications and antibiotic-resistance markers with potent promoters that are functional in the target bacteria. By utilizing these tools and further optimizing the conjugation protocol, the successful delivery of the deactivated Cpf1-based CRISPRi system for regulating gene expression was achieved. In this study, the authors demonstrated the application of their pipeline to modulate metabolites produced by the gut microbiome, such as the bile acid pool in mice, which has numerous implications on host health.

The studies described earlier indicate that DNA conjugation is a viable method for modulating microbiome function, although the area is still in infancy and needs further development, particularly an assessment of safety in humans. This is pertinent in the case of mobile genetic elements that are used to deliver the payloads, as such elements have a high tendency to propagate further into nontarget members of the microbiome by horizontal gene transfer. <sup>304</sup> In addition, limited studies on nonmodal members of the microbiome remain a bottleneck in their genetic engineering because it is difficult to reliably predict the functionality of the payload introduced into these microorganisms.

3.2.2. Use of Enzyme Inhibitors. The metabolic activity of microbial enzymes is an important process through which the microbiome can influence host health. Apart from playing a role in the normal functioning of the microbe itself, these enzymes can also metabolize drugs, prodrugs, and xenobiotics administered to the host, leading to unintended and potentially adverse outcomes.<sup>305</sup> This can be mitigated by using inhibitory chemicals that act on the specific microbial enzyme. For example, SN-38 is an anticancer drug used in colon cancer and against lung and brain tumors formed from the intravenously administered prodrug, CPT-11, in the liver. Subsequently, it is glucuronidated by UDP-glucuronosyltransferase in the liver into SN-38G, which is excreted into the GI tract.<sup>306</sup> Here, it is again converted to SN-38 by the bacterial  $\beta$ -glucuronidase enzymescausing diarrhea and prohibiting an escalation in chemotherapy drug dosage. Although eliminating gut bacteria by antibiotics can potentially prevent SN-38 toxicity, this method has several drawbacks, as discussed in section 3.1.2. Instead, Wallace et al. employed high-throughput screening to identify potent inhibitors of the bacterial  $\beta$ -glucuronidase that do not target orthologous mammalian enzymes. <sup>307</sup> In addition, these inhibitors neither killed the bacteria nor harmed mammalian cells. In a mice model, the inhibitor was found to protect mice from the chemotherapy drug's toxicity, although improvements in drug efficacy remain to be studied.

Inhibitors for the gut microbiome-dependent production of trimethylamine (TMA) *N*-oxide (TMAO), which is associated with cardiovascular risks in humans, have also been reported. Dietary choline, phosphatidylcholine, and carnitine are converted into TMA by the microbial choline-TMA lyase enzymes, which is subsequently converted to TMAO by hepatic flavin monooxygenase. Wang et al. identified an analogue of choline, 3,3-dimethyl-1-butanol (DMB), that was observed to inhibit multiple microbial TMA lyases without killing the microbes. The treatment of mice fed a high choline or L-carnitine diet with DMB resulted in lower plasma TMAO levels, the attenuation of atherosclerotic lesions, and the

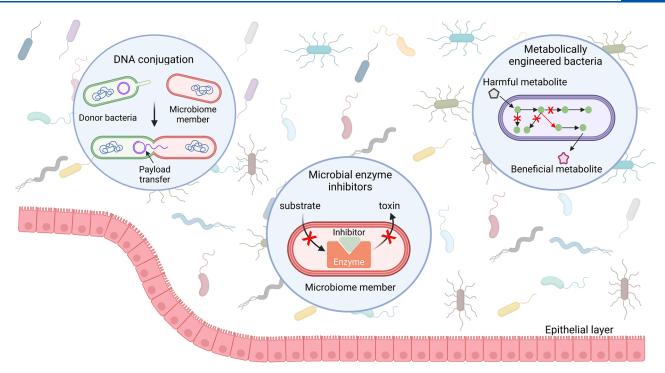


Figure 3. Modulation of microbiome functionality by DNA conjugation, enzyme inhibitors, and engineered bacteria.

formation of macrophage foam cells. The same group also developed two other TMA lyase inhibitors, fluoromethylcholine and iodomethylcholine, that are nonlethal and able to accumulate within the microbe, resulting in a sustained decrease in TMAO levels in mice for 3 days after a single oral dose. Treatment with these inhibitors also prevented thrombus formation by reducing platelet adherence to the collagen matrix in the arteries in mice fed choline. Interestingly, the inhibitors caused a change in gut microbiome composition despite being nonlethal, suggesting additional selection pressure on the microbes due to the inhibitors, which might eventually lead to resistance development.

The development of enzymatic inhibitors to modulate microbiome function faces two major challenges. First, the inhibitor should be able to act on all related microbial enzymes. In the absence of broad-spectrum inhibition, noninhibited microbial species may compensate, resulting in no net change in microbiome function. Second, the presence of human enzymes with similar functions as the microbial enzyme will necessitate the screening of a large library of chemicals to find targets that are inhibitory toward microbes and not mammalian cells, which might not be achievable in some cases.

**3.2.3.** Microbiome Metabolite Modulation by Engineered Microorganisms. Among the various strategies to modulate microbiome function, the most advanced is the administration of exogenous engineered bacteria that are either commensal or probiotic. Contrary to the administration of wild-type bacteria that are primarily used to change microbiome composition, engineered bacteria are equipped with novel functionalities that enable the regulation of microbiome function. By using the large repertoire of synthetic biology tools, bacteria can be reprogrammed to specifically target a disease, resulting in a highly precise autonomous therapy. Such therapies have been developed to target metabolic diseases, 312–314 prevent cancer, 315–317 inhibit pathogens, 318,319 and address other conditions 320–322 (for recent reviews, see refs

323–326). An increasing number of such studies have been reported thus far. However, in this section, we will only present studies that show how the microbiome has been implicated to play a major role in disease development through its metabolites, thus necessitating its functional modulation for therapy.

There is an intense interplay of metabolites between the human microbiome and its host, with microbiome metabolic pathways significantly associated with 34% of blood and 95% of fecal metabolites.<sup>327</sup> One such metabolite is ammonia, which is primarily produced by the metabolism of amino acids in our food by gut microbes. The human body regulates the levels of ammonia via the liver's urea cycle.<sup>328</sup> However, in the case of liver failure, the metabolite accumulates in the blood, which can act as a neurotoxin at high concentrations.

To develop a therapy that reduces ammonia levels, E. coli Nissle 1917 (EcN) was genetically modified to convert gut ammonia into L-arginine, boosting the urea cycle. 329 The metabolic pathway was placed under the control of the anaerobic-inducible fnrS promoter (PfnrS) such that metabolic conversion was initiated only in the gut's low-oxygen environment. In addition, the bacterial strain was made auxotrophic for thymidine as a biocontainment strategy. This strain was found to reduce ammonia levels in mice given a high-protein diet or administered with thioacetamide, a liver toxin. The engineered bacterium was also found to be safe to use in healthy volunteers at a dose of  $5 \times 10^{11}$  CFU three times a day for 14 days.<sup>329</sup> However, in a Phase 2 clinical trial, the engineered EcN failed to significantly reduce blood ammonia in patients with cirrhosis compared to placebo. 330 The engineered EcN has since been repurposed for anticancer therapy in conjunction with immune checkpoint inhibitors by metabolizing waste ammonia from tumors into L-arginine, increasing T cell response against cancer (Figure 3).<sup>316</sup>

SCFAs produced by the fermentation of dietary fibers by the gut microbiome have anti-inflammatory activity and play an important role in various host processes, such as improving

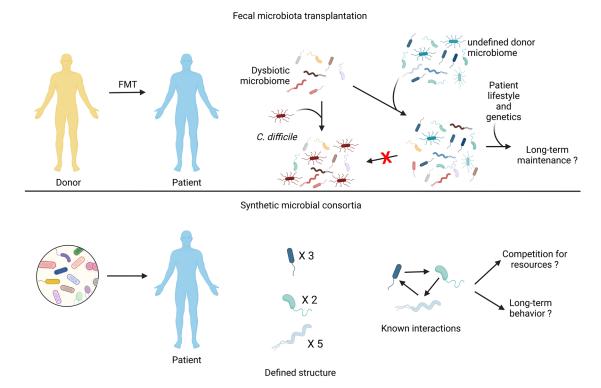


Figure 4. Engineering the microbiome by fecal microbiota transplantation (FMT) and synthetic microbial consortia. The main features of both strategies are presented along with unknown parameters (marked by "?").

intestinal barrier integrity and reducing colon cancer risk.<sup>331</sup> SCFAs, particularly butyrate, are also able to regulate appetite, decrease insulin resistance, promote fat oxidation, and stimulate the release of insulinotropic hormones. 332,333 Due to these effects on host metabolic activity, butyrate is likely to have a therapeutic effect on patients with obesity and diabetes. Oral delivery of butyrate is challenging due to its poor bioavailability and disagreeable odor and taste. Thus, different bacteria have been metabolically engineered to produce butyrate in the gut as an alternative treatment for obesity and diabetes. Bacillus subtilis SCK6 naturally produces butyrate at very low levels and thus was engineered to produce butyrate via the butyryl CoA:acetic acid CoA transferase pathway that is present in the gut's butyrogenic microbes. 334 Further deletion of competing metabolic pathways yielded a strain that can produce 1.5 g/L of butyrate in vitro. When evaluated in mice given a high-fat diet, the engineered bacteria were able to retard weight gain, reduce visceral fat accumulation, and improve glucose tolerance. In addition to the decrease of Firmicutes and increase in Bacteroidetes, analysis of the metabolic pathways of the gut microbiome revealed a significant enhancement of the genes involved in carbohydrate, amino acid, vitamins, and energy metabolism.<sup>334</sup> EcN has also been engineered to produce 0.5-1 g/L butyrate in vitro but has yet to be evaluated in in vivo models. 335,330

Extracellular adenosine triphosphate (eATP) is an IBD-associated metabolite produced by activated immune cells and the gut microbiome. eATP is known to promote proinflammatory cytokine production and neuron apoptosis, as well as to suppress anti-inflammatory responses. A probiotic yeast, *S. cerevisiae*, was genetically modified to sense eATP in the gut and respond by producing ATP-degrading enzymes that convert eATP to AMP. In turn, AMP is further broken down to immunosuppressive adenosine.<sup>337</sup> To enable *S. cerevisiae* to respond to eATP, a human P2Y2 receptor evolved to sense

eATP with 1 000-fold higher sensitivity was integrated into the probiotic strain. This was combined with a potent ATPase from potato to create an IBD treatment. In mice models of colitis, the engineered probiotic ameliorated inflammation, as observed by the lower expression of pro-inflammatory cytokines, reduced colon shortening, and improved histological scores. The engineered probiotic performed better than the probiotic with constitutively expressed ATPase and even standard-of-care IBD therapies, suggesting the therapy's potency against inflammatory disorders.

### 3.3. Natural and Synthetic Microbial Consortia

Microbial communities, such as those in the human microbiome, perform complex functions shaped by dynamic interactions within the community and with the environment. Such intricate functions are unlikely to be recapitulated by individual populations, which has resulted in heightened interest in microbial consortia. Additionally, increased microbial diversity within the consortia might also impart resilience against environmental changes, such as nutrient limitation.<sup>338</sup> Currently, two types of microbial consortia are being used for therapeutic applications: naturally occurring with undefined composition, such as the gut microbiome, which can be used as a fecal microbiota transplant (FMT); and synthetic, comprising a predetermined cocktail of probiotics or commensal microbes. Here, we will discuss some examples of these microbial consortia being used to target a variety of diseases and the challenges faced by these strategies.

**3.3.1. Fecal Microbiota Transplantation.** FMT involves the administration of dried feces, either the patient's own or from a healthy donor to the patient (Figure 4). The route of administration might vary, ranging from oral consumption of freeze-dried capsules and small/large intestine infusion to enema.<sup>339</sup> The aim is to reconstitute the native disease-

associated microbiome into a healthier version to provide a positive health impact. FMT has shown the most promise in recurrent C. difficile infection with a resolution rate of 85-90% and is highly recommended for both mild and severe cases.<sup>340</sup> After initial vancomycin treatment for patients with *C. difficile* in a randomized clinical trial, FMT showed higher efficacy than a continued vancomycin regimen, accompanied by an increase in Bacteroidetes and Clostridium clusters and a decrease in Proteobacteria.<sup>341</sup> In mice and humans given broad-spectrum antibiotics, autologous FMT enabled the rapid and complete recovery of the dysbiotic microbiome within days and was the most effective intervention. 342 Surprisingly, the administration of a cocktail of probiotics significantly delayed the recovery of the microbiome compared to spontaneous recovery, with the recovery being incomplete. This was attributed to the soluble factors produced by the probiotics that caused the inhibition of the indigenous microbiome. 342

Apart from *C. difficile* infection, FMT has been used to treat ulcerative colitis, <sup>343,344</sup> type 2 diabetes, <sup>345</sup> irritable bowel syndrome, <sup>346</sup> and cancer; <sup>347</sup> however, only limited case studies and clinical trials have been reported to date. Further well-designed clinical trials are required to confirm FMT's efficacy for indications beyond *C. difficile* infection.

There are certain aspects of FMT that must be considered and studied before it can be broadly applied in clinical settings. The selection of an appropriate donor is one of the key components for FMT success. Although autologous FMT is likely to provide superior compatibility, it may not always be feasible, thus necessitating a stool donor. Meticulous screening of the donor's gut microbiome for potentially pathogenic species is required prior to FMT to ensure procedural safety. This has especially become relevant in the COVID-19 pandemic due to the detection of the SARS-CoV-2 virus in individual fecal samples.<sup>348</sup> Additionally, studies have been undertaken to identify the donors whose stool samples are most likely to result in successful engraftment of the gut microbiome. A high taxonomic diversity and the presence of specific bacterial families in the donor stool have been proposed to be key to disease-specific restoration of gut homeostasis in recipients.<sup>34</sup> Beyond donor selection, the recipients' genetics, diet, and lifestyle are also likely to play a role in FMT maintenance.<sup>335</sup>

As an alternative to FMT, Seres Therapeutics developed SER-109, a natural consortium of bacterial spores from healthy donors to treat recurrent C. difficile infection. 350 The spores are primarily from bacteria belonging to Firmicutes, as other phyla are not spore-formers. This is advantageous as previous studies have shown Firmicutes to be associated with a relatively higher concentration of secondary bile acids, which inhibits vegetative growth of *C. difficile*. 350 Moreover, these bile acids also prevent C. difficile spore germination, which is a major cause of recurrent infection.<sup>351</sup> The use of a purified spore consortium allows for oral delivery because the spores are resistant to gastric acid, reducing the risk of pathogen transmission seen in FMT. In a randomized, double-blind, placebo-controlled Phase 3 clinical trial comprising 182 patients, the group of patients receiving oral SER-109 after standard antibiotic regime showed a reduced recurrence of C. difficile infection compared to the patients receiving placebo after antibiotics (12% vs 40%).352 Patients receiving SER-109 showed an engraftment of the dosed species within 1 week, which persisted for the study duration (8 weeks) with an increased abundance of Firmicutes and decreased proinflammatory Enterobacteriaceae. A higher concentration of secondary bile acids in the fecal samples from patients given SER-109 was also observed. 352

3.3.2. Synthetic Microbial Consortia. Due to the undefined community structure in naturally occurring microbiomes, it is challenging to quantify the contributions of individual members toward a specific function, making it unsuitable for further optimization. Synthetic microbial consortia can fulfill this unmet need as they can be rationally designed with reduced microbial complexity to perform functions that can predictably impart a therapeutic benefit to the host. For example, Tanoue et al. identified a consortium of 11 bacterial strains isolated from the feces of healthy human donors that can robustly induce interferon-γ-producing CD8<sup>+</sup> T cells in the intestine. 353 The 11 strains are low-abundance members of the microbiome including those belonging to Bacteroides spp. and Parabacteroides spp., Eubacterium limosum, Ruminococcaceae bacterium cv2, Phascolarctobacterium faecium, and Fusobacterium ulcerans.<sup>354</sup> Upon colonization in mice, the microbial consortium provided resistance to infection by Listeria monocytogenes and enhanced the efficacy of immune checkpoint inhibitors in tumor models.353

GUT-108, a rationally designed consortium of 11 bacterial strains, was also shown to reverse colitis in a mice model. 355 The consortium comprises strains that can perform functions that are reduced in the gut microbiome of IBD patients. These include the production of SCFAs such as butyrate and propionate, secondary bile acids, deoxycholic acid, and lithocholic acid, as well as indole and its derivatives. 356,357 Additionally, several strains in GUT-108 produce antimicrobial factors that prevent the growth of opportunistic pathogens, which may further exacerbate the inflammatory response. 355 The administration of GUT-108 to a mice model of experimental colitis prevented the expansion of pathogenic bacteria belonging to the Enterobacteriaceae family, which was observed in mice receiving phosphate buffered saline (PBS). The successful engraftment of 10 strains of GUT-108 was observed in mice, which led to reduced inflammatory cytokines, induced IL-10 production, and increased the levels of metabolites that promote mucosal healing and immunoregulatory responses.<sup>353</sup>

Beyond the synthetic consortia comprising wild-type bacterial strains, engineered bacteria with defined characteristics can also be used to develop synthetic communities. For example, Kong et al. created six two-strain consortia with unique interactions ranging from commensalism to predation. They used these strains to further develop three- and four-strain member communities with predictable behavior, demonstrating the successful engineering of social interactions in a bacterial community. This approach may enable the design of synthetic consortia with more complex behavior that can impart beneficial effects to the host.

The design of microbial consortia presents unique challenges compared to single microbial populations. Similar to natural microbiomes, synthetic consortia should be able to maintain homeostasis and prevent certain members from outcompeting others even in different nutritional environments. However, this is difficult to achieve because microbes often show varied abilities to metabolize different resources, making the long-term prediction of homeostasis unfeasible. Applying synthetic biology to incorporate genetic circuits, such as the oscillatory predator—prey system, into the microbes may potentially mitigate competition between consortium members. Another challenge is predicting the behavior of the microbial consortia, which can be attributed to the lack of omics-level understanding of

Table 2. Summary of Strategies for Engineering the Microbiome To Target Different Diseases

strategy	indication	therapeutic microbes/ molecules	features	ref
probiotics	obesity and diabetes	A. muciniphila	the bacterium is depleted in patients with obesity, type 2 diabetes, and hypertension	230
			obese patients who had received the probiotic for 3 months showed improved insulin sensitivity and reduced cholesterol	
			pasteurized bacteria showed higher efficacy compared to live bacteria	
	IBD	F. prausnitzii	IBD patients exhibit reduced abundance of F. prausnitzii	240, 24
			administration of the bacteria led to reduced disease severity in a mice model of colitis	
			no clinical trial conducted yet, likely due to difficult cultivation of the bacteria	
		S. boulardii	the probiotic can be used as an adjuvant to induce remission or prevent relapse of $\operatorname{IBD}$	246
			clinical trials using the probiotics alone have not yet been conducted	
	atopic dermatitis	R. mucosa	the bacteria isolated from healthy individuals	248
			treatment with the commensal bacteria led to an improved skin barrier and reduced <i>S. aureus</i> burden	
			the therapeutic effect was limited to the bacterial isolate from healthy volunteers and not the patients	
	urinary tract infection	L. crispatus CTV-05	L. crispatus CTV-05 is a vaginal isolate that adheres to the vaginal epithelial layer and suppresses the growth of pathogenic E. coli	251
			in a Phase 2 clinical trial, probiotic administration led to a significant reduction in the recurrent UTI incidence	
rebiotics	atopic dermatitis	mixture of GOS and FOS	GOS and FOS can promote Bifidobacterium growth	258
			patients receiving GOS and FOS showed lower incidence of atopic dermatitis with expansion of Bifidobacteria	
	Crohn's disease	FOS	patients receiving FOS showed an improvement in disease and increased fecal Bifidobacteria	260
	colorectal cancer	inulin gel	developed colon-retentive inulin gel that increased the abundance of beneficial bacteria such as <i>Bifidobacteria</i> and <i>Akkermansia</i>	261
			expansion of the beneficial bacteria led to the increased antitumor efficacy of immune checkpoint blockers	
argeted antibiotics	C. difficile infection	ridinilazole	ridinilazole is a small DNA-binding molecule with highly specific action against C. difficile	269
			it was found to be superior to standard-of-care vancomycin in a Phase 2 clinical trial $$	
	Gardnerella infection	engineered endolysin PM- 447	bacterial vaginosis caused due to reduced <i>Lactobacillus</i> spp. and increased <i>Gardnerella</i> spp.	274
			engineered endolysin formed by domain shuffling of native enzymes in Gardnerella	
			PM-447 has negligible activity against <i>Lactobacillus</i> but can target <i>Gardnerella</i> , including dispersing the biofilm	
acteriophages	alcoholic hepatitis	bacteriophage against <i>E. faecalis</i>	cytolysin, produced by $\it E. faecalis$ , is responsible for liver injury in alcoholic hepatitis	282
			targeting the bacteria with the phage led to a reduction in liver injury and no significant perturbation of gut microbiome composition	
	colorectal cancer	phage against F. nucleatum	phage isolated from human saliva	283
			F. nucleatum causes chemoresistance in colorectal cancer	
			by targeting the bacteria with the phage in conjunction with a chemotherapy drug, superior efficacy was observed in mice model	
	acne vulgaris	bacteriophages against	an aqueous cream formulated comprising bacteriophages against P. acnes	286
		P. acnes	isolated from human skin flora	
nzyme inhibitors	colon cancer	inhibition of bacterial	validation only in in vitro model bacterial $\beta$ -glucuronidase converts the harmless byproduct of the anticancer drug	307
izyme innoitors	colon cancer	$\beta$ -glucuronidase	into toxic SN-38	307
	1: 1	· 1-1-c CTD (A.1	developed enzyme inhibitors neither killed the bacteria nor harmed the mammalian cells	200
	cardiovascular diseases	inhibition of TMA lyases	microbial TMA lyases involved in the synthesis of TMAO, which is associated with cardiovascular diseases	308
			developed inhibitors of TMA lyases are nonlethal to microbes and are able to sustain TMAO decrease in mice models	
ngineered microbes	pathogen elimination	commensal and probiotic bacteria	the bacteria is engineered to sense the quorum signaling molecules produced by the pathogen $$	288
			in response, the engineered bacteria secretes the antibacterial agent	
	hyperammonemia	engineered EcN	EcN was engineered to convert ammonia into L-arginine to boost the urea cycle	329
			biocontainment strategy incorporated into the bacteria for safety	
			although effective in various mice models, the bacteria failed to show significant	

Table 2. continued

strategy	indication	therapeutic microbes/ molecules	features	ref
	diabetes and obesity	engineered B. subtilis	the bacteria were metabolically rewired to produce 1.5 g/L butyrate in vitro	334
			in an obesity mice model, the engineered bacteria were able to retard weight gain and fat accumulation	
	IBD	engineered S. cerevisiae	S. cerevisiae genetically engineered to sense eATP by using a human P2Y2 receptor	337
			in response to eATP, the engineered yeast produces ATP-degrading enzymes	
			the engineered microbe performed better than the standard-of-care IBD therapies in a colitis mice model	
natural microbial consortia	recurrent <i>C. difficile</i> infection	fecal microbiota transplantation	fecal sample from healthy donor administered to patients	341
			risk of pathogen transmission	
			genetics and lifestyle of the recipient may affect efficacy	
		SER-109, bacterial spores from healthy donors	oral delivery possible	352
			reduced risk of pathogen transmission	
			clinical efficacy observed in Phase 3 trial	
synthetic microbial consortia	L. monocytogenes infection	11 bacterial strains from healthy donors	the consortium can induce CD8 <sup>+</sup> T cells in the intestine	353
	cancer		the bacterial strains are low-abundance members of the microbiome	
			the consortium can enhance the efficacy of immune checkpoint inhibitors in tumor models	
	colitis	GUT-108, consortium of 11 bacterial strains	the consortium can perform functions reduced in IBD patients	355
			production of antimicrobial factors to prevent pathogen growth	
			induction of anti-inflammatory molecules	

metabolic interactions between the microbes. The knowledge gained through multiomics studies combined with computational modeling will ultimately aid in our ability to design synthetic microbial consortia with predictable and controllable functions.  $^{360}$ 

# 3.4. Current Challenges and Limitations of Microbiome Engineering

The examples presented earlier (summarized in Table 2) demonstrate that it is feasible to engineer the microbiome for various therapeutic outcomes in the host. So far, in vitro and in vivo evaluations of different methods to modulate microbiome composition and function have shown promising results. With the exception of FMT, most therapeutics are still awaiting successful clinical translation. There are unique challenges to the development of different therapeutics based on a rationally engineered microbiome, which have been alluded to earlier. However, to further accelerate microbiome engineering to develop safe and effective therapeutic products, there is a need to bridge the knowledge gaps pertaining to microbe—microbe and microbe—host interactions and build novel tools to broaden the scope of microbiome engineering, as discussed later.

**3.4.1.** Inadequate Use of Multiomics Studies. As part of the Human Microbiome Project (HMP), different microbial communities in the human body have been comprehensively characterized by 16S rRNA gene sequencing to decipher the microbiome's taxonomic complexity. Meanwhile, metagenomic whole-genome shotgun sequencing provides insight into the pathways present in the microbiome and their functions. However, these data sets do not shed light on intramicrobial community interactions, how the microbiome interacts with the host, and how the host responds to its resident microbiome. A thorough understanding of these interactions is necessary for determining the causal role that the microbiome plays in disease development, which will eventually lead to novel therapies

through microbiome engineering. To achieve this, healthy and diseased cohorts will have to be subjected to various multiomics assays encompassing not only the microbiome but also the host. Such studies are ongoing for preterm birth, IBD, and type 2 diabetes as part of the second phase of the HMP. In the case of IBD, stool samples will be collected from patients with IBD and healthy controls. These will be used for multiomics assays such as 16S rRNA gene sequencing, metagenomic and metatranscriptomic sequencing, protein profiling, and metabolomics. In addition, the corresponding changes in the host will be determined by performing RNA-seq on colon biopsy samples, studying DNA methylation of the host genome, and interrogating the host cells with different metabolites. Importantly, the study will also include a survey of yeast and viruses found in the microbiome. Sequencing and sequencing and interrogating the microbiome.

3.4.2. Spatiotemporal Control of the Engineered Microbiome. For the engineered microbiome to safely impart health benefits to the host, it should exhibit predictable spatiotemporal behavior. Environmental perturbations and spatial organization are major variables that can influence the complex and dynamic interactions of the microbiome.  $^{363,364}\,\mathrm{For}$ example, Sheth et al. studied the microbial biogeography of the mouse intestine and showed both positive and negative associations between individual taxa. 365 Additionally, the authors showed that mice given a low-fat or high-fat diet led to changes in the species richness and altered spatial organization of the colon microbiome. Therefore, the engineered microbiome should be resilient to any perturbations and be able to adapt to its community structure over different time scales to continue providing the intended therapeutic effect to the host. This is particularly important in the case of engineered microbiomes with an associated fitness cost, which might lead to evolutionary adaptations through random mutations and horizontal gene transfer. Similar adaptations

have been observed in the commensal microbe *Bacteroides* fragilis, leading to its long-term prevalence in the human gut. <sup>366</sup> Moreover, mechanisms to safeguard the host against unintended microbiome functions should be built-in as a safety feature.

A potential way to achieve this level of dynamic control of the composition and function of the microbiome is through synthetic biology. Genetic functionalities, such as biosensors, can be incorporated into the microbiomes such that they can be controlled through external stimuli. Additionally, genetic circuits can be designed for autonomous feedback control of the microbiome.

3.4.3. Genetically Intractable Microorganisms. The majority of microbiome members most relevant to human health, such as Clostridium and other anaerobic Firmicutes, remain poorly cultivable and genetically intractable.  $^{\rm 367}$  This has hindered our ability to interrogate these microorganisms for mechanisms by which they modulate human health. Elucidating these mechanisms will not only deepen our understanding of host-microbiome and intramicrobiome interactions but also lead to more robust microbiome-based therapeutics that include these health-promoting bacteria. Thus, there is a great need for the development of novel genetic engineering tools that can be used in such genetically intractable microorganisms. These tools can range from well-characterized promoters, ribosome binding sites, terminators, and reporter genes to more complex genomic manipulation systems, such as CRISPR-Cas and homologous recombination.

In the following section, we will discuss how these challenges can be overcome with the aid of enabling technologies, advancing our understanding of microbiome—host interactions and the development of robust microbiome-based therapeutics.

# 4. ENABLING TECHNOLOGIES FOR MICROBIOME RESEARCH AND ENGINEERING

Many studies including the examples mentioned in section 3 support the feasibility of engineered microbe therapy for microbiome-related diseases. 368-371 However, despite many proof-of-concept studies, several clinical trials using engineered microbes could not show efficacy or were terminated due to a lack of efficacy in the Phase 2 trials (e.g., NCT03447730, NCT03234465, and NCT03447730). One contributing factor toward the lack of efficacy in these engineered microbes may be the absence of regulatory mechanisms. Typically, these mechanisms control the expression of exogenous genes under stable promoters in the microbiome to enhance efficacy or reduce side effects. One of the advantages of utilizing microbes as therapeutics is their high programmability compared to conventional chemical medicine. Synthetic biology approaches are expected to enhance efficacies and reduce side effects to leverage on the high programmability bestowed by the implementation of precise spatial/temporal control into engineered microbes.

To fully harness engineered probiotics for therapy, it is essential to keep in mind engineering approaches and designs based on a more sophisticated knowledge of the mechanistic insights of microbiome-associated diseases and the microbiome itself. As mentioned in section 3.1.1, the administration of pasteurized *A. muciniphila* to overweight/obese individuals improved insulin sensitivity and reduced cholesterol and body weight without changing the gut microbiome composition. Beyond reinforcing the importance of monitoring microbiome activities, this result suggests that the microbiome's function or activity shifts can be more important compared to microbiome

composition. Accordingly, functional meta-omics such as metabolomics, metatranscriptomics, metaproteomics, and multimeta-omics are gaining attention for investigating the causality of microbiome-associated diseases at the molecular, gene, and pathway levels.

In this section, we will review various meta-omics approaches for understanding molecular insights in the microbiome community and host interactions. We will also touch upon the many synthetic biology tools that can facilitate the reprogramming of microbes to potentially develop robust therapeutics with unique advantages over other strategies for microbiome engineering.

### 4.1. Functional Omics Approach

Metagenomics is a powerful tool for investigating the dynamics of microbiota, having revealed the association between microbiota composition and many diseases. Yet, metagenomic data provides limited mechanistic insights into microbiome-linked health states. To address this gap, applying functional metaomics approaches such as metabolomics, metatranscriptomics, and metaproteomics to microbiota are expected to provide further insights. Here we will review the current progress in deploying functional omics to microbiota for investigating critical metabolites, microbiome activity, and interactions of host/diseases. Furthermore, we will review the microbiome and host genetics interactions.

4.1.1. Discovery of Novel Metabolites and Biosynthesis. Interestingly, metabolites from microbiota play a more critical role in host-microbe interaction rather than the commensal microbe itself. However, the metabolites and biosynthesis pathways that underlie host-microbe interactions are still unclear. Several studies have shown that microbes interact with the host by modulating signal pathways via metabolites.<sup>372</sup> For instance, SCFAs such as acetate, butyrate, and propionate are fermented in the colon from dietary fibers. These SCFAs are known to modulate the differentiation and accumulation of regulatory T cell ( $T_{reg}$  cell) by activating the G-protein coupled receptor. In turn, activated  $T_{reg}$  cells produce the anti-inflammation factor IL-10, which is assumed to suppress gut inflammation diseases like IBD. The link between microbiome composition and metabolites is known to be indirect due to the functional redundancy of metabolic pathways, which suggests the interchangeability of some species. Thus, analyzing differences in microbial composition may not reflect functional metabolite differences. In fact, phylogeny prediction from metabolomic data has been so far unsuccessful, indicating the difficulty of linking microbiome and metabolome data. 376 For this reason, identifying the metabolites associated with disease can provide more straightforward data for helping implement synthetic approaches for therapeutic purposes.

Untargeted metabolomics using mass spectrometry has been used for the discovery of key disease-associated metabolites. The discovery of key disease-associated metabolites. When the discovered that imidazole propionate toward type 2 diabetes and discovered that imidazole propionate was present at higher concentrations among patients with type 2 diabetes. Imidazole propionate is produced from histidine by gut microbes and impairs insulin signaling through mTORC1. Previously, researchers identified the UrdA gene that produces imidazole propionate in vitro, finding that the UrdA gene was more abundant in subjects with type 2 diabetes. Another example is phenylacetylglutamine (PAGIn), which was identified through untargeted metabolome analysis as a biomarker

associated with a higher risk of cardiovascular diseases among type 2 diabetes patients. In the gut, PAGln is converted from dietary phenylalanine by the microbial porA gene, where it reportedly enhanced platelet activation-related phenotypes by stimulating G-protein coupled receptors. 378

Because untargeted mass spectrometry identifies molecules by comparing the spectrum patterns of chemicals of interest to chemicals in a reference database, metabolite identification solely relies on the references used in the analysis. This means that untargeted identification is unable to pinpoint unknown chemicals. In fact, it is estimated that >90% of metabolites in the microbiome lack matches in public databases.<sup>379</sup> Such uncharacterized metabolites are called "dark matter". 379 To tackle this problem, machine learning-based reference generation is gaining prominence. Machine learning is a method for automatically building mathematical models for classification or prediction, wherein an algorithm learns patterns from training data sets. Machine learning has been used across a wide variety of applications, proving its versatility.<sup>380</sup> Currently, machine learning is being used for identifying microbiome metabolites during data preprocessing (peak detection, alignment, and identification), data processing (structure identification and compound quantification), and biological interpretation.<sup>381</sup> For instance, DarkChem used a deep learning approach to generate MS/MS libraries for predicting chemical properties in metabolomics and chemical identification.<sup>38</sup>

4.1.2. Metatranscriptomics and Metaproteomics. In metatranscriptomics, the transcriptional activities of microbiota are analyzed using RNA sequencing. Unlike metagenomics, metatranscriptomics allows for the identification of active microbes, genes, and pathways in microbial communities. Metatranscriptomics has since been applied to a number of different types of microbiotas, 383 including those from seawater, 384,385 soils, 386,387 and human microbiota. 388 Likewise, metatranscriptomics approaches in human microbiota have enabled a deeper understanding of host-microbiota interactions, active microbes and their pathways, and expression changes in disease progression. 389,390 Nowicki et al. demonstrated how metatranscriptomics was applied to subgingival plaque from gingivitis patients. The study observed a significant shift of microbiota composition and increased virulence genes expression as gingivitis progressed, 389 demonstrating the importance of transcriptomics analysis for understanding molecular mechanisms during disease progression. Meanwhile, Schirmer et al. performed metatranscriptomics on a longitudinal IBD cohort to elucidate gene expression and their differences among healthy and IBD patients. <sup>390</sup> In the study, they detected species-specific biases in transcriptional activity. One example is the methylerythritol phosphate pathway (MEP) genes. They showed that Bacteroides vulgatus became the main transcriptional contributor of MEP at severe IBD stages. This study highlighted how metatranscriptomics analyses are a powerful tool for monitoring microbiome activities and gaining further insights into the role of the microbiome in diseases.

Although RNA expression can be a good indicator of gene expression, it does not always reflect protein abundances. Alternatively, metaproteomics can be engaged as an alternative approach for monitoring gene activity in microbiota. Metaproteomics was initially applied to investigate microbial function in environmental and gut microbiome samples from twins in a 2009 study. So far, multiple studies have demonstrated how metaproteomics analysis can be deployed for human microbiome samples.

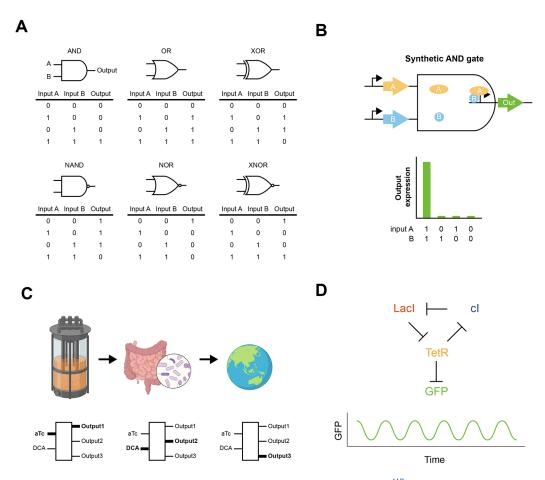
common as metatranscriptomics because of its lower throughput compared to deep sequencer-based analysis, metaproteomics can provide information on the post-translational modifications of proteins<sup>396,397</sup> and the expression of proteins secreted from the host cell,<sup>398,399</sup> both of which cannot be monitored through metatranscriptomics.

Another study by Zhang et al. analyzed lysine acetylation (Kac) changes in proteins in the gut microbiome of patients with Crohn's diseases and negative control subjects. 400 In the study, they employed a peptide immune-affinity enrichment strategy followed by mass spectrometry to characterize Kac peptides and their changes in the human gut microbiome. Using the strategy, they identified Kac sites of 52 host and 136 microbial proteins that were differentially modified between Crohn's disease patients and nonpatients. Likewise, Lobel et al. investigated the effect of diet on the post-translational modifications of proteins in the gut microbiome in chronic kidney disease (CKD) model mice. <sup>397</sup> They discovered that a high sulfur amino acid-containing diet resulted in the post-translational modification of microbial tryptophanase. The protein modification reduced the production of uremic toxin in CKD model mice. These studies show that microbiome function can be altered via post-translational modifications without changing their composition, underlying the importance of metaproteomics for investigating mechanistic insights of microbiome-related phenotypes.

Given the advantages and disadvantages associated with metaomics approaches, multimeta-omics approaches have been employed to comprehensively understand microbiota gene activities as well as interactions within microbiota or between the microbiota and host. One Human Microbiome Project team conducted a multiomics analysis on a longitudinal IBD cohort to elucidate the molecular profiles of the host and microbiome activity.401 In their study, they conducted metagenomics, metatranscriptomics, and metaproteomics on stool and serum samples from 132 subjects for 1 year. This study provided a comprehensive description of host and microbial activities, which helped identify microbial, biochemical, and host factors that contributed to dysregulation. Mills et al. 402 combined metagenomics, metapeptidomics, metaproteomics, and metabolomics approaches from 250 fecal samples for ulcerative colitis (UC) studies. They discovered that proteinase activity derived from B. vulgatus was associated with UC severity. In vitro and in vivo experiments also showed that treatment with a proteinase inhibitor could suppress UC symptoms, highlighting the potential of a multiomics approach in identifying causal genes from complicated microbiomes.

# **4.1.3.** Microbiome Genome-Wide Association Study. Conventionally, it was held that interindividual variations in the microbiome composition were mainly influenced by environmental factors rather than the host's genetic factors. However, evidence from twin 404,405 and family 406 studies have indicated the presence of interactions between the microbiome and host genetics. In a U.K. twin study, the relative abundances of gut microbiota were more highly correlated within monozygotic twins than dizygotic twins, suggesting that the interactions between the microbiome and host genetics influenced gut microbiota composition. A better understanding of host genetics and microbiome interactions can assist precision medicine approaches and enhance the efficacy of engineered microbe therapeutics.

A larger proportion of identified genetic loci linked to microbiome variance are related to the dietary preferences of



**Figure 5.** (A) Logic gates and their truth tables. (B) One example of the transcriptional AND gates. <sup>417</sup> The output gene expression is activated only when both A and B are induced. (C) Application of synthetic logic gates for the spatiotemporal control of engineered microbes. (D) Transcriptional network found in repressilator. TetR represses CI, cI represses LacI, and LacI represses TetR.

hosts or their immunity. One of the most replicated genomic loci is the LCT locus. Studies across U.K., Dutch, Canadian, and Finnish populations have shown an association between the LCT locus and Actinobacteria or Bifidobacterium. LCT encodes lactase, which digests lactate in the gut. One of the strongest associations with Bifidobacteria in the LCT locus is the functional SNP rs4988235. This SNP is known to be strongly associated with lactose intolerance and lactase expression. Therefore, lactose intolerance is the inability to digest lactose caused by the lower expression of lactase. Bifidobacteria are known to have the ability to digest lactose, 407 indicating that they compensate for reduced lactase activity in the host. Another well-replicated locus in microbiome composition is ABO. The association of the microbiome to the ABO locus was reported in studies conducted among German, Finnish, and Dutch populations. However, the bacteria associated with the ABO locus differs among the three countries. In addition to the ABO loci, FUT2 is also known to be associated with the microbiome, with FUT2 genes determining the ABO antigen on mucosal cells. The functional association between ABO and FUT2 suggests that the ABO locus is a contributing factor to microbiome composition. However, the mechanistic insights behind the microbiome changes have yet to be elucidated. Although dozens of genomics loci were reportedly associated with microbiota composition, most of the loci were not replicated in other studies.

Finally, host genetic variance can influence the host's health states. One well-known example is the ATG16L1 locus. ATG16L1 encodes a subunit of the autophagy-related ATG12-ATG5/ATG16L1 complex and is involved in autophagosome formation. However, its function is not limited to autophagy; it is also involved in immune responses such as inflammation. 408 Several genome-wide association studies (GWASs) have shown the association between IBD and the ATG16L1 locus. 409,410 Chu et al. revealed that ATG16L1 is essential for immunomodulation by B. fragilis, which is known to secrete outer membrane vesicle (OMV) including immunomodulatory molecules that induce regulatory T cells. 411 They showed that the risk allele of ATG16L1 (A300) did not show OMV-mediated regulatory T cell induction for mucosal inflammation suppression and also displayed a deficiency of ATG16L1. These results indicate host variant-microbiota interaction and the importance of considering host genetic factors for therapeutic purposes.

# **4.2. Synthetic Biology and Cellular Reprogramming of Microbes**

Synthetic biology aims to design and engineer organisms with desired functions that are predictable and consistent. To achieve this aim, synthetic biology introduces into biology engineering principles such as modularization, logic gate, and circuit design. These efforts enable researchers to choose optimal genetic parts (e.g., promoter, ribosome binding site, terminator, peptide tag, and biosensor) as well as construct all types of logic

gates<sup>414</sup> (AND, OR, NOR, NOT, XOR, and NAND) and synthetic devices that can control microbes similar to machines like the oscillator<sup>415</sup> and genetic toggle switch.<sup>416</sup> In turn, these well-characterized and tunable parts allow the assembly of more functional systems through an optimization cycle called the design—build—test—learn cycle (DBTL cycle). In this subsection, we will review how synthetic biology can be used for cellular reprogramming. We will also discuss how synthetic biology allows the spatiotemporal regulation of engineered microbes and how such techniques can be applied to microbiome environments.

4.2.1. Regulating Microbe Behavior Using Genetic **Logic Circuits.** A logic gate is an electronic device that performs a basic logical function by processing binary inputs to binary outputs. Most logic gates process two inputs into one output following the truth table (Figure 5A). For example, AND gate outputs 1 only when both inputs are 1 and OR gate outputs 1 when either input is 1. Each logic gate can operate a simple task. However, devices with multiple logic gates can process complicated tasks like a computer. Synthetic biology has enabled the development and implementation of genetic logic gates by mainly connecting transcription networks using transcription factors. In synthetic logic gates, expression represents 1 and no expression represents 0. An AND gate can be constructed by using a promoter that requires two transcription activators for its transcription (Figure 5B). The AND gate can be a very powerful and useful tool for modulating inputs and an output. For example, Merk et al. constructed a genetic AND gate that expresses output genes when both ITPG and tetrathionate exist. 418 Because IPTG is an artificial inducer and tetrathionate is gut inflammation marker, this AND gate allows for the temporal and spatial regulation of the expression of specific genes. While GFP was used as an output in their proof-of-concept study, the AND gate can be used to temporally or spatially control the in situ secretion of medicine by changing the output accordingly.

In addition, such logic gates are scalable and can accommodate an increase in the number of outputs and inputs by connecting multiple logic gates that can process more complicated environments. Taketani et al. developed a 2-input and 3-output logic circuit by combining three NOR gates. This circuit was then implemented in Bacteroides thetaiotaomicron, enabling the bacteria to express different genes in an environment-dependent manner such as the bioreactor stage, the gut stage, and after release from the host. 417 In this study, they employed anhydrotetracycline (aTc) and the bile acid deoxycholic acid (DCA) as inputs and demonstrated how the engineered B. thetaiotaomicron changed its behavior in an inputdependent manner in a human gastrointestinal model. These proof-of-concept studies show that scalable logic gates allow for the spatial and temporal regulation of engineered microbes under complicated environments. Therefore, administering standalone engineered microbes that behave in an environment-dependent manner improves the specificity and localization of their activity, improving overall efficacy.

An oscillator is an electronic device that outputs a periodic signal. Elowitz and Leibler constructed a genetic oscillator that expresses a marker gene periodically. In the original genetic oscillator, three transcription repressors, LacI, TetR, and cI, were encoded in one plasmid called repressilator, and GFP was encoded under pLtetO1 in the other plasmid. Because TetR represses cI, cI represses LacI, and LacI represses TetR expression, the expression of each gene changed periodically.

The GFP reporter gene was regulated by TetR, and its expression also changed periodically. Although the original repressilator showed periodic GFP expression, only 40% of cells were found to behave properly. Accordingly, the experiment was found to not be robustly designed—causing error propagation by stochastic effects. A follow-up study done by Potvin-Trottier et al. improved the original by removing the degradation tags attached to the repressors and introducing a "sponge" sequence that soaked up TetR molecules. 419 These changes reduced stochastic effects and improved the robustness of the genetic oscillator. Recently, an updated version of the oscillator was tested by Riglar et al. in a mouse gut environment to quantify bacterial dynamics in vivo. 420 They developed the RINGS (repressilator-based inference of growth at single-cell level) method to estimate bacterial generations after synchronization. By using the RINGS method, they succeeded in doing so in the mouse gut environment to understand in vivo bacterial dynamics. In the study, an oscillation system was used to monitor bacterial dynamics in vivo, but the oscillation system could be utilized for the periodic administration of drugs in situ as well. Moreover, these studies highlighted how synthetic genetic circuits can function properly in microbiome environments through the DBTL cycle.

The examples of genetic circuits presented earlier demonstrate how microbes can be reprogrammed to exhibit desired behavior using different genetic parts, such as promoters, repressors, and activators. In the following sections, we will review different types of cellular reprogramming that can potentially improve the efficacy of microbial therapies for microbiome-associated diseases.

**4.2.2. Biosensors and Quorum Sensing.** To process environmental information, microbes can be equipped with biosensors that can detect pH, temperature, light, metals, and chemical and biological compounds, among others. <sup>421</sup> In synthetic biology, biosensors are integrated into synthetic genetic circuits to detect and process environmental information for downstream processing, which allows engineered microbes to change their behaviors in an environment-dependent manner and to communicate among bacterial communities.

To engineer therapeutic microbes, implementing biosensors into genetic circuits can provide several advantages. First, biosensor-based expression can reduce genetic burden and improve the genetic stability of engineered microbes. It is well-known that implementing a synthetic genetic circuit can exert a burden on microbes, <sup>422</sup> resulting in genetic mutation, a loss of engineered function, and growth defects in the engineered microbes. <sup>420</sup> Most of the genetic burden arises from the consumption of cellular resources, reducing cellular fitness. <sup>423</sup> Therefore, silencing genetic circuit activity through biosensors can reduce genetic burden and keep engineered microbes functional. Another approach for reducing genetic burden is by cooperating multiple engineered microbes via quorum sensing (QS).

Second, biosensor-based expression can reduce the risks of off-target and resultant side effects. All medications have side effects mainly due to their dosage or unwanted targeting. Biosensor-based expression control has often been utilized for cancer therapy development, which requires specific targeting to reduce severe side effects. One common strategy is to express anticancer products under a hypoxia promoter from bacteria that can colonize tumor microenvironments, such as *Salmonella typhimurium*, *Clostridium novyi*, and EcN. He et al. engineered EcN to express Tum-5 or p53 under oxygen-dependent P<sub>vhb</sub>

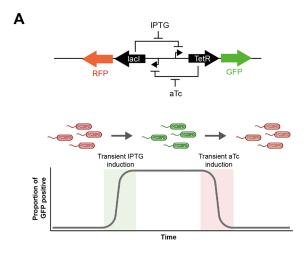
promoters, <sup>424,425</sup> which activates transcription under hypoxic areas such as the tumor microenvironment. In the study by He's team, engineered EcN was injected into mice bearing tumors. They confirmed that the engineered EcN could repress tumor growth and that no obvious side effects could potentially occur from nonspecific targeting. More research regarding reprogramming microbes for cancer treatment has been reviewed elsewhere. <sup>426</sup> Another promising target for engineered microbes with biosensors is pathogens. As discussed in section 3.1.2, employing QS machineries and antimicrobial agents enable the engineering of microbes that sense and eliminate specific bacteria secreting QS signal molecules. Third, biosensors can be used for diagnostic tools by combining memory systems, which will be reviewed in the next section.

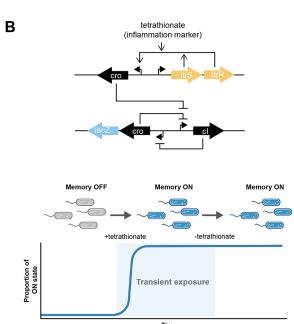
Biosensor specificity is crucial for the proper function of engineered microbes, especially in complex heterogeneous environments, such as the human gut, which contains several structurally similar ligands. However, wild-type biosensors are often nonspecific and react to several structurally similar molecules. Hence, it is necessary to develop biosensors that can differentiate between such ligands in vivo to ensure an accurate response to the disease. Meyer et al. employed directed evolution to engineer 12 highly specific biosensors with lower cross-reactivity. Recently, Rottinghaus et al. engineered EcN for the specific sensing of aromatic amino acids or neurochemicals through the rational improvement of biosensor specificity based on the protein structures. Les Such studies are expanding the toolbox of high-quality biosensors for therapeutics purposes.

**4.2.3. Memory Systems.** Cellular memory is a phenomenon wherein transient signals are converted into a prolonged response. Cellular memory is common in most organisms and is used widely in biological events such as differentiation, epigenetics, and immunity. Due to its potential applications, many types of synthetic memory circuits have been constructed based on various mechanisms. Such as transcription factors, DNA recombination, and RNAi.

Memory systems can be classified as either reversible or irreversible. Reversible memory systems can be turned off upon the detection of another signal. Gardner et al. constructed a genetic toggle switch that can function as a reversible memory system by implementing LacI and cI or TetR to mutually inhibit their expression (Figure 6A). 416 Because repressors mutually inhibit expression, coexpression is at an unstable steady state and the expression of either repressor becomes randomly dominant in each cell without any stimulus. Gardner et al. also demonstrated that temporal exposure to inhibitors of the repressors could switch the cellular state and that the state lasts long after inhibitor withdrawal. On the other hand, an irreversible memory system cannot be turned off once a signal is detected. O'Gorman et al. developed an irreversible memory system utilizing Flippase that excises the reporter's cis-element after a specific stimulus and keeps reporter gene expression on in a mammalian cell.<sup>433</sup>

Synthetic memory circuits have proven to be a useful research tool for investigating fundamental biological mechanisms and as a potential tool in medicine and industry. For instance, the CreloxP system for creating tissue-specific knockout strains is an irreversible memory system <sup>436</sup> for investigating gene function in specific organs and tissue because it does not perturb gene function in other organs and tissues. The system is also used to trace the developmental lineage of cells. <sup>437</sup> For industrial applications, synthetic memory circuits can be used to reduce





**Figure 6.** (A) Gene circuit of the genetic toggle switch developed by Gardner et al. 416 TetR and lacI each repress transcription. Either tetR or lacI expression is dominant without inducer. Each inducer (aTc or IPTG) inhibits a repressor and induces expression. Once cells are exposed to an inducer, either lacI or tetR become dominant. (B) Toggle switch-based memory circuit for a gut inflammation diagnosis tool. Cro is activated upon the detection of the inflammation marker tetrathionate by the ttrS/ttrR component. Once the circuit has detected tetrathionate, expression of cro becomes dominant even after tetrathionate withdrawal.

the cost of inducers for constant induction to produce biochemicals of interest. <sup>432</sup> By combining biosensors, synthetic memory systems can be used as noninvasive diagnosis tools for gut microbiome-associated diseases. Kotula et al. demonstrated that a synthetic memory circuit using a cI/cro bistable genetic switch could function in vivo. <sup>438</sup> In a follow-up study done by Riglar et al., <sup>420</sup> they developed a diagnosis tool for gut inflammation by implementing a memory system and a biosensor to detect the inflammation marker tetrathionate in the *E. coli* strain NGF-1 (Figure 6B). They used the TtrR/TtrS two-component system to sense tetrathionate and trigger the memory device and cI/cro bistable genetic switch for a memory

device. This may allow the detection of disease onset in intestinal organs before symptoms worsen.

Biosensors are an essential building block for processing environmental cues in synthetic biology approaches. However, the number of biosensors that can monitor the inner states of the microbiome are still limited. To overcome this problem, Naydich et al. developed a high-throughput memory system than can be used to screen for biosensors that function in murine gut. 439 They implemented a cI/cro bistable toggle switch as a memory device. In the memory off state, the cI repressor is dominant, while cro and downstream lacZ expression is off. The trigger device is composed of a dominant negative mutant of cI (cI<sup>DN</sup>) under a candidate promoter that is triggered by the condition of interest. cI<sup>DN</sup>, which has an N55K mutation in its DNA-binding region, forms a dimer with wild-type (WT) cI and derepresses cro and lacZ expression. Once cro is expressed highly enough, cro can keep repressing cI even without a stimulus. Hence, by generating a trigger device library, a highthroughput memory system can be used to screen for promoters that are active during the condition of interest. They tested this high-throughput memory system to screen for promoters with an increased response to an inflamed murine gut environment. This research exemplifies how synthetic biology approaches can be used as an investigation tool.

4.2.4. Kill Switches for Biocontainment and Drug **Delivery.** As research on developing microbes as therapeutic agents has progressed, issues relating to the biosafety of genetically modified organisms have emerged, raising concerns over the increased risk of spreading potentially hazardous biological materials to environments. Hence, the implementation of effective biocontainment systems is essential for real world usage, especially in cases where engineered wild-type commensal microbes are used due to their resilience in wild environments compared to commonly used laboratory strains. Many biocontainment strategies have already been developed through synthetic biology approaches. 440 The most readily used strategy is to introduce auxotrophic mutations, in which microbes are engineered to be dependent on specific nutrients for growth. However, auxotrophic strains may survive in natural environments that provide the nutrient. Moreover, this strategy can be used only for microbes that can be isolated and cultured in vitro. Therefore, the kill switch can be an alternative strategy for biocontainment.

Kill switches have long been used in synthetic biology. In 1987, Molin et al. developed a conditional suicide switch by expressing the Hok gene under the Trp promoter repressed by tryptophan. 441 The Hok gene causes the depolarization of the cellular membrane and results in cell death. They showed that Hok can work in broad ranges of both Gram-positive and Gramnegative bacteria. Contreras et al. utilized the nuclease gene from Serratia marcescens for a suicide gene combined with a thermoinduction promoter. 442 In 2016, Chan et al. developed the "deadman" and "passcode" kill switches, 443 which are passively activated. The deadman switch activates the toxin gene and inactivates an essential gene in the absence of a signal (ATc). To increase robustness, a genetic toggle switch was implemented in the deadman switch (Figure 7A). On the other hand, the passcode death switch employed the hybrid LacI-GalR family TFs<sup>444,445</sup> to allow multiple input molecules that control cell death (Figure 7B). They showed that the loss of IS1 and IS5, which caused a large percentage of inactivating mutations in the passcode circuit after long-term culturing, increased the passcode's stability.

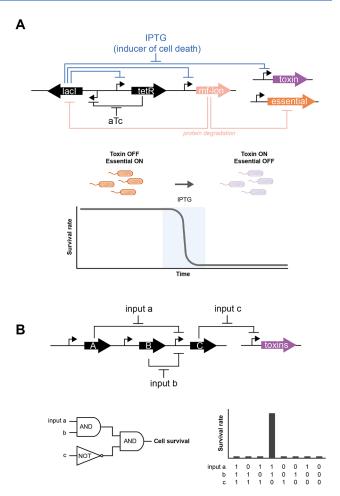


Figure 7. (A) Genetic circuit of deadman kill switch. Output of the toggle switch activates a toxin and inactivates an essential gene to kill cells, which can be induced by IPTG. Mf-lon proteinase then degrades lacI and essential genes to increase circuit stability. (B) Genetic circuit of passcode kill switch. A, B, and C represent repressor genes. The loss of input a or b or the addition of input c activates the toxin gene expression.

Due to the kill switch's lethality, engineered cells always have a selection pressure to eliminate the kill switch. 443 Hence, improving the genetic stability of the kill switch is essential for proper and effective function. It was reported that mutagenesis is one of the major reasons why an engineered circuit loses function. 443 Thus, restoring the mutation to its original sequence may help increase stability. Chavez et al. developed a mutation-restoring system using CRISPR/Cas9. 446 In their system, gRNAs were designed to recognize specific mutations and convert the mutations back to their original functional sequences. They demonstrated that this system worked in a murine gut environment and reduced mutation frequencies drastically. Although this system can prevent specific mutations only, this method can be potentially applied to prevent hotspot mutations causing the loss of function of kill switches.

Another approach to improve the kill switch's stability is functional redundancy within the circuit. Rottinghaus et al. engineered EcN with an aTc-inducible kill switch, which induces the expression of gRNA and Cas9 to cut the EcN genomic DNA. They demonstrated that  $\sim 10\%$  and  $\sim 80\%$  of loss-of-function mutations in the kill switch were accumulated at the gRNA and the Cas9 cassettes, respectively. To decrease the

probability of losing Cas9 and gRNA functions, they employed four functionally redundant Cas9 cassettes and two gRNA cassettes to achieve a  $10^{-8.6}$  killing efficiency, which surpassed the recommended killing efficiency of  $10^{-8}$  by the National Institutes of Health.

Another application of the kill switch is in the release of functional compounds from cells to target cells, e.g., pathogens, inflammation, and cancer cells in situ. Although proteins can be designed to be secreted by adding a secretion signal, nonpermeable small compounds require a specific transporter or channel to be exported from cells. Because those transporters and channels are not available in many cases, the kill switch can be a versatile alternative method to secrete any compounds, including large and small molecules. Saeidi et al. 448 demonstrated the feasibility of using a kill switch for secretion purposes. In the study, a sensor device that sensed *P. aeruginosa* through quorum sensing by the LasR protein activated cell lysis and released the Pyocin S5 protein to kill *P. aeruginosa*. However, this method still carries the risk of releasing the genetic material introduced into the engineered microbes to the environment

### 4.3. Chassis Engineering

To facilitate cellular reprogramming of the desired microbe, the relevant genetic circuit has to be introduced into the microbe. Such microbes are typically referred to as the "chassis", with the term based on the structural framework of equipment and machines like automobiles. Accordingly, the microbe is usually transformed with plasmids to introduce new functions without changing its genomic DNA. In fact, many early proof-of-concept studies were done through plasmid-based approaches. 415,416 Still, problems with the plasmid-based approach include the lower stability of plasmid DNA as well as expression noise caused by copy number differences among cells. Hence, the integration of genetic parts or devices into the chassis' genomic DNA is preferable, especially for therapeutic purposes. Moreover, chassis engineering enables the removal or enhancement of the organisms' features to engineer a more suitable chassis for therapeutic purposes. Despite the advantages of chassis development, the genetic manipulation of commensal microbes still lags behind model organisms such as E. coli and S. cerevisiae—both of which are not major members of the human microbiome. In this subsection, we will review current developments in CRISPR-based gene manipulation of microbes and in situ DNA transfer methodologies, which allow for the genetic modification of genetically intractable microorganisms.

4.3.1. CRISPR-Based Gene-Editing/Manipulation **Tools.** CRISPR was originally discovered as an immune system in archaea, although nowadays it is recognized as a genetics tool. CRISPR is mainly applied for gene editing through the introduction of DNA breaks, followed by homologous recombination using donor DNAs. CRISPR-directed homologous recombination has accelerated genome engineering in many organisms including those with genomes previously considered difficult to manipulate. 449 Currently, CRISPR tools are available in a wide range of commensal bacteria and yeast such as E. coli, <sup>450</sup> Lactobacillus, <sup>451</sup> Clostridium, <sup>452</sup> Bacteroides, <sup>453</sup> Staphylococcus, <sup>454</sup> Bacillus, <sup>455</sup> Saccharomyces, <sup>456</sup> and Candida <sup>457</sup> for site direct <sup>1</sup> for site-directed mutagenesis and gene deletion/insertion. CRISPR has also been used to engineer the microbiome and commensal microbes for characterizing the gene function of microbiome-related phenotypes. Guo et al. employed CRISPR/ Cas9 to demonstrate the potential link between host immunity response and SCFAs produced by Clostridium. 367 In the study,

Guo et al. developed a CRISPR/Cas9 system for manipulating Clostridium sporogenes and deleted SCFA-related genes, resulting in the decreased SCFA production. By comparing immune responses between mice administered with wild-type strain and knockout strains, they showed that the loss of SCFA increased IgA plasma cells. This supports the immunomodulation function of SCFA. Ultimately, the study showed that CRISPR-based microbiome genetics can help identify causal genes and their interactions, which are required in synthetic biology approaches.

Although CRISPR-driven gene editing is widely available for many organisms, DNA breaks caused by CRISPR/Cas9 tend to lead to cell death rather than gene editing in a majority of commensal microbes that have limited homologous recombination activity. Hence, CRISPR/Cas9 cannot be used for the majority of nonmodel commensal bacteria. For these microbes, CRISPRi, CRISPRa, or base editors can be less-toxic alternatives. CRISPRi and CRISPRa are tools that modulate transcription activity rather than edit genes. Both tools employ dCas9, which has DNA binding activity rather than DNase activity, fused to a transcription repressor or activator, respectively, to modulate transcription near the loci sgRNA recognizes. Hence, CRISPRi and CRISPRa function as programmable transcription factors that ideally can target promoters of any gene. Their programmability allows knockdown screening for bacteria using CRISPRi libraries. 458 Accordingly, Peters et al. constructed a CRISPRi library that covers all of the essential genes of B. subtilis for functional screening and identifies the mechanism of action of antibiotics.4

Due to the high programmability of CRISPRi and CRISPRa, they can be used as custom transcription factors for constructing genetic circuits. A number of CRISPR-based synthetic gene circuits have since been constructed. Many logic gates, buffers, NOT, MAND, MA

While CRISPR/Cas9 gene editing introduces mutations through DNA strand breaks and subsequent homologous recombination, base editors mutate DNA using deaminase. Base editors employ dCas9 or nickase Cas9 fused to a deaminase that can convert nucleotides. 465,466 For instance, the cytosine base editor converts C to G, 466 while the adenine base editor facilitates A to T conversion. 465 Because base editing is quite new, there is no study yet utilizing it for microbiome engineering. However, microbiome editing using base editors is expected to soon be applied in therapeutics due to its lower toxicity compared to using bacteria.

Another promising CRISPR-related tool for microbiome engineering is the CRISPR-associated Tn7 transposon (CAST). 467,468 CAST was first reported in 2017 by Peters et al. They reported that some bacteria carry a Tn7-like transposon, including Cas effector proteins of the CRISPR subtype I-F. The Tn7-like transposon lacks TnsE, which mediates target insertion of the Tn7 transposon. Hence, they hypothesized that this type of transposon hijacked and utilized the CRISPR system for DNA recognition, 467 with CAST transposing through a CRISPR-

mediated manner. In 2019, two groups proved that CAST inserted into the target site in a CRISPR-mediated manner in *E. coli*. <sup>469,470</sup> Both showed that the target site can be reprogrammed by changing the gRNA sequence. Strecker et al. showed that DNA insertion efficiency can reach up to 80% without any selection, with the frequency of off-target insertion being <1%. According to studies, insertion efficiency is highly dependent on target sites. Strecker's group also detected on-target insertion in 29 loci out of the 48 sites tested. In 2022, Rubin et al. applied CAST to develop the DNA-editing all-in-one RNA-guided CRISPR—Cas transposase (DART) system, which was site- and species-specific in a mouse gut microbial community. <sup>471</sup> This will be reviewed in the next section.

All in all, CRISPR enables the manipulation of a wide variety of genomic DNA. DNA delivery remains the first step in experimental manipulation for downstream processes, yet the majority of commensal microbes are not culturable. Consequently, in the next section, we will review the current progress of gene manipulation of microbiota in situ.

**4.3.2. Genetic Manipulation of Microbes In Situ.** Multiomics studies have uncovered how microbiota genes are associated with many human diseases and health states, as mentioned in section 2. However, elucidating the causal relationship of microbiota genes to host disease remains tricky mainly due to the difficulty of genetic manipulation in nonmodel microbiota as well as the challenges involved in culturing them in vitro. <sup>472</sup> Consider how conventional DNA delivery methodologies such as chemical transformation and electroporation can only be applied in vitro. Therefore, alternative technologies for transferring DNA into microbiota in situ are gaining traction in microbiome engineering. In this section, we will review the current progress of DNA delivery technologies and commensal bacteria manipulation methods in situ.

To adapt to various conditions, environmental bacteria are known to actively exchange their plasmid DNAs among different species—a process called horizontal gene transfer (HGT).<sup>4/3</sup> One of the most widely used HGT methods is bacterial conjugation, where plasmid DNA is transferred from a donor bacteria to a recipient bacteria through a type IV secretion system. 474 The gut microbiota is considered a fertile environment for conjugative gene transfer. It has been reported that bacterial conjugation can be utilized to manipulate gut microbiota from various donors in situ. 475,476 Recently, bacterial conjugation has become increasingly prominent as a microbiome engineering tool. Ronda et al. developed a technique called metagenomic alteration of gut microbiome by in situ conjugation (MAGIC), which enables the transfer of plasmid DNAs from an E. coli donor strain using the Inc.Palpha-family RP4 conjugation system to gut microbiota in situ. 477 This system allowed them to introduce DNA to both Gram-positive and Gram-negative bacteria. The conjugation plasmid encoding the transposon and transposable cassette allows the integration of DNA into genomic DNA in situ. Fluorescence-activated cell sorting (FACS) and 16S RNA analysis showed that at least 5% of gut bacteria were successfully modified in situ. However, transconjugants were no longer detectable after 72 h, likely due to toxicity or vector instability. Consequently, further improvements are needed for MAGIC to be used in the stable genome manipulation of gut microbiota for the investigation and identification of causal genes in microbiome-associated diseases.

Another method for transferring DNA into bacteria in complex communities in situ is by using phages. Phages are

viruses that infect specific bacteria and transfer their genomic DNA into bacterial cells. After infection, phage-derived plasmid DNA is integrated into host genomic DNA or replicated in the host. By cloning a desired DNA fragment into the phage's genomic DNA, exogenous genes can be transferred to bacterial cells, where they confer new functions with a fairly high efficiency. Notably, the transduction efficiency of the P2 bacteriophage can reach nearly 100%, 478 far beyond other DNA delivery methods like chemical transformation or electroporation. Because of target specificity, high efficiency, and activity in situ, phages are now being applied in microbiome engineering. 479,480 For instance, Citorik et al. utilized a phage to deliver CRISPR/Cas9 with a gRNA targeting the antibiotic resistance gene in a synthetic E. coli population in waxworms and changed bacteria composition.  $^{481}$  In addition, Lam et al. demonstrated that phages could deliver a CRISPR/Cas9 cassette to E. coli in the murine gut, 294 showing that CRISPR/ Cas9 delivered by a phage in situ could cause a chromosomal large deletion.

Knowing genetically tractable microbes and choosing an optimal DNA transfer method for microbes of interest in situ are crucial because there is no versatile DNA transfer method for all commensal microbes. Rubin et al. 471 developed the environmental transformation sequencing (ET-seq) and DNA-editing all-in-one RNA-guided CRISPR-Cas transposase (DART) systems, techniques that allowed the identification of genetically tractable bacteria in microbial communities and organism- and locus-specific genetic manipulation in situ. In ET-seq, DNA containing a nontargeted mariner transposon was transferred to microbial communities by conjugation, electroporation, or natural transformation, after which transposon-integrated loci were identified by deep sequencing. Following the identification of tractable bacteria and an optimal DNA delivery method, organism- and locus-specific CRISPR-associated transposase plasmids were designed and introduced into soil and infant gut microbiota. Using DART, they targeted strain-specific genomic loci of *E. coli* and demonstrated that DART could change *E. coli* strain composition. Another example of the optimization of DNA manipulation was done by Jin et al. They developed a pipeline to manipulate nonmodel gut microbiota (*Clostridia*) in vitro and in the host.<sup>303</sup> Their pipeline included the identification of compatible rep and ori combinations for the vector, antibody selection for both E. coli and Clostridia, and, finally, the reduction of restriction modifications to increase stability for stable conjugation and genome modification.

### 5. CHALLENGES AND LIMITATIONS

In section 2, we reviewed microbiome studies that showed the link between the microbiome and disease/health states. These studies suggested that the microbiome plays a crucial role in human health through microbiome—host interactions. Meanwhile, in section 3, we reviewed how compositional and functional alterations of the microbiome could affect human health states, indicating that the microbiome can be a contributing factor to several diseases. Revealing the causality of microbiomes in diseases enables its modulation by various strategies. However, microbiome engineering therapies have not yet yielded a viable commercial product. Although we are awaiting the results of clinical evaluation in some cases, other therapies, particularly engineered bacteria therapies, have been unable to perform well in clinical trials so far due to lack of efficacy.

Accordingly, we propose three limitations hindering the feasibility of leveraging engineered microbiome therapy for diseases: (1) the lack of mechanistic understanding underlying microbiome-associated diseases at multiple levels; (2) the challenges involved in modifying genetically intractable organisms; and (3) the spatiotemporal regulation of the engineered microbiome. In section 4, we reviewed the current progress of meta-omics studies and synthetic biology tools that can help resolve these limitations. In particular, metabolomics, metatranscriptomics, metaproteomics, and multimeta-omics approaches enable association studies at the metabolite, gene, and gene interaction levels—deepening our knowledge of the molecular mechanisms of microbiome-associated diseases and allowing the design of reprogrammed microbes with predictable and regulated behavior against specific targets. Moreover, CRISPR and in situ DNA transfer technologies using bacterial conjugation and phages permits the manipulation of genetic intractable microbes both in vitro and in situ. Advances in such new DNA manipulation technologies will help in the identification of responsible genes and the engineering of commensal microbes in vitro and in situ.

We also reviewed how common design principles in synthetic biology taken from engineering fields facilitate spatiotemporal regulation in engineered microbes with synthetic genetic circuits. Although most experiments were performed in in vitro conditions, some were applied in the gut microbiome, proving the feasibility of spatiotemporal regulation within the microbiome environment.

As mentioned earlier, functional meta-omics and synthetic biology approaches help resolve the limitations hindering the feasibility of engineered microbe therapy. However, experimental tools must still be specifically tuned for studying the microbiome, as synthetic biology emerged independently of microbiome studies. Hence, most available tools are designed for E. coli to work under constant laboratory conditions. To date, a collection of standardized genetic parts for the nonmodel commensal microbiome remains limited or is unavailable. For instance, E. coli genetic parts were originally developed for in vitro purposes; hence, most of their functionalities in microbiome environments are not well-evaluated and may cause the loss of robustness in genetic circuits. A robust design is crucial for therapeutic applications due to the diversity of the microbiomes found in individuals. Therefore, the optimization of genetic parts and gene circuits for in vivo environments is set to be accelerated by developments in in vitro platforms such as organs-on-a-chip and organoids.

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### Notes

The authors declare no competing financial interest.

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Shohei Kitano obtained his Ph.D. degree from the Tokyo Institute of Technology in 2018. He is currently working in synthetic genomics in the Chang Lab in SynCTI at the National University of Singapore. His research interest lies in genomes and phenotypes and phenomena elicited by genomes and their interactions including the microbiome field. He is keen to employ synthetic approaches to omics studies.

Ginette Puah obtained her Bachelor's and Master's degrees in Chemistry and Biological Chemistry from Nanyang Technological University. She is currently a Ph.D. candidate at the National University of Singapore and is also a trainee in the WIL@NUS Corporate Laboratory supported by the Singapore Economic Development Board (EDB) industrial programme. Under the guidance of A/Prof. Matthew Chang and Dr. Sandra Kittelmann, she is applying synthetic biology to beneficial microorganisms for the production of exotic fatty acids.

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