

Genomic sequencing-based mutational enrichment analysis identifies motility genes in a genetically intractable gut microbe

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A major roadblock to understanding how microbes in the gastrointestinal tract colonize and influence the physiology of their hosts is our inability to genetically manipulate new bacterial species and experimentally assess the function of their genes. We describe the application of population-based genomic sequencing after chemical mutagenesis to map bacterial genes responsible for motility in *Exiguobacterium acetylicum*, a representative intestinal Firmicutes bacterium that is intractable to molecular genetic manipulation. We derived strong associations between mutations in 57 *E. acetylicum* genes and impaired motility. Surprisingly, less than half of these genes were annotated as motility-related based on sequence homologies. We confirmed the genetic link between individual mutations and loss of motility for several of these genes by performing a large-scale analysis of spontaneous suppressor mutations. In the process, we reannotated genes belonging to a broad family of diguanylate cyclases and phosphodiesterases to highlight their specific role in motility and assigned functions to uncharacterized genes. Furthermore, we generated isogenic strains that allowed us to establish that *Exiguobacterium* motility is important for the colonization of its vertebrate host. These results indicate that genetic dissection of a complex trait, functional annotation of new genes, and the generation of mutant strains to define the role of genes in complex environments can be accomplished in bacteria without the development of species-specific molecular genetic tools.

motility | mutagenesis | comparative genomics | gene annotation

The advent of DNA-sequence-based approaches to survey microbial environments has led to a deepened appreciation for the diversity, ubiquity, and functions of microbial life. For instance, the gastrointestinal tract of humans and other vertebrates is colonized by complex microbial communities that promote gut development, nutrient metabolism, and immune homeostasis (1). Of particular importance to human health, gut microbes have emerged as major risk determinants for obesity and metabolic disorders, in part because of their role in modulating accessibility and absorption of energy-rich dietary nutrients in vertebrates (2). For example, colonization of germ-free zebrafish with *Exiguobacterium* sp. ZWU0009, a Firmicutes bacterium originally isolated from the zebrafish intestine, enhanced the ability of intestinal enterocytes to absorb dietary fat (3). Unfortunately, the molecular bases for how bacteria like *Exiguobacterium* sp. ZWU0009 colonize the intestine and influence host physiology are poorly understood. Indeed, most microbes are not amenable to genetic manipulation because methods for robust DNA transformation, insertional mutagenesis, and *trans*-expression of genes are largely lacking. For a select group of microbial species, including members of the *Bacteroides* genus, some strains are amenable to transposon mutagenesis and have been invaluable in helping decipher the requirement of individual genes in gut colonization and nutrient homeostasis (4, 5). However, genetic tools do not exist for the vast majority of intestinal microbes. As a result, the function of individual genes and their contribution to host-microbe and microbe-microbe interactions within the gut often relies on information inferred from homology to genes

characterized in phylogenetically unrelated, but genetically tractable, bacterial systems. This reliance on previously characterized genes has emerged as a major block in the functional annotation of novel genes emerging from metagenomic studies.

Results and Discussion

We sought to develop broad methods for genetic analysis of “genetically intractable” microbes, by using *Exiguobacterium* sp. as a representative gut microbe. We first generated a draft genome sequence of strain ZWU0009 (Taxonomy ID: 1224749) (3, 6). The ZWU0009 genome is ~3.2 Mb and includes 3,289 coding sequences, 30 rRNA operons, and 76 tRNAs. A comparative genome analysis indicated a close relationship with other previously characterized *Exiguobacterium* and that this isolate is a variant of *Exiguobacterium acetylicum* (7). We reasoned that one could apply whole-genome sequencing to monitor experimentally induced genetic variations in *E. acetylicum* ZWU0009 and then derive associations between gene variants and phenotypically selected traits, a process we term “mutational enrichment analysis after phenotypic selection” (MEAPS) (Fig. 1A). We chose to perform a MEAPS dissection of *Exiguobacterium* motility, a multigenic complex trait that is important for some bacterial pathogens to colonize the vertebrate gut (8, 9). In contrast, the role of motility in colonization by commensal bacteria is less clear. Metatranscriptomic analysis of healthy gut microbiotas

Significance

There is broad interest in the role microbial communities play in human health. Although DNA-sequencing technologies enabled a broad assessment of microbial diversity and genomic content, our understanding of the molecular mechanisms underlying microbe-microbe and microbe-host interactions has proceeded much more slowly because only a small fraction of microbes are amenable to molecular genetic manipulation. We describe a method, independent of recombinant DNA tools, to perform genetic analysis in any cultivatable microbial species. We identified determinants of motility in a member of the vertebrate microbiome, the Firmicutes *Exiguobacterium acetylicum*, and experimentally determined a role for motility in animal colonization by this previously uncharacterized commensal bacteria that is important for host nutrient homeostasis.

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Data deposition: The sequences reported in this paper have been deposited in the BioProject database, <https://www.ncbi.nlm.nih.gov/bioproject> (accession no. PRJNA318259). A complete, annotated genome and its analysis have been deposited in the BioProject database, <https://www.ncbi.nlm.nih.gov/bioproject> (accession no. PRJNA205584) and the GenBank database, <https://www.ncbi.nlm.nih.gov/genbank/> (accession no. CP018057).

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indicates a broad dampening of the expression of motility genes in Firmicutes and Proteobacteria as a result of innate and adaptive immune responses (10, 11), suggesting that the expression of flagella may confer a disadvantage to commensal bacteria. *E. acetylicum* expresses peritrichous flagella, as assessed by transmission electron microscopy (TEM), when grown in rich medium (Fig. 1B).

Based on keyword searches and reciprocal BLAST queries we predicted that 126 *E. acetylicum* genes are potentially involved in motility (Dataset S1). To determine the number of nonmotile *E. acetylicum* mutants we needed to sequence to identify mutations overrepresented in motility loci, we first modeled MEAPS experiments with the assumption that 100 genes are required for motility and that each nonmotile mutant had one motility-disabling mutation. These simulations indicated that, by sequencing the genomes of 400–500 nonmotile mutants with an average of 10 mutations per genome, we can capture ~70% of all motility genes (Fig. S1). Further changes in the number of mutants sequenced or mutagenesis rates only led to marginal increases to the number of new motility genes that could be identified.

We generated *E. acetylicum* mutants by treating bacteria with ethyl methyl sulfonate (EMS) and used the ability of *E. acetylicum* to swarm in soft agar plates to enrich for nonmotile mutants. *E. acetylicum* inoculated in the center of a 0.3% agar plate will spread as large halos of turbidity emerging from the inoculation site. After serial passages of pools of mutagenized bacteria in soft agar with repeated collection of bacteria from the site of inoculation, we tested bacterial clones for defects in swarming motility (Fig. S2) and stored them as individual clones.

We next applied a pooling strategy to sequence 440 nonmotile *E. acetylicum* mutants and identified all of the mutagen-induced

single nucleotide variants (SNVs) by mapping unique sequence reads to the reference genome. To compensate for mutational biases because of gene length and relative %GC content, we also sequenced 700 EMS-generated mutants that had not been selected for the loss of motility. Overall, we identified 4,009 and 5,013 SNVs among the selected (nonmotile) and unselected strains, respectively. Next, we compared mutation frequencies between these sets of mutant strains and identified two regions in the *E. acetylicum* genome that displayed a marked accumulation of nonsynonymous, but not of synonymous, mutations (Fig. 1C and Fig. S3). Region I encompasses most predicted flagellar structural genes and chemotaxis genes (Fig. 1D). Region II encoded additional predicted flagellar structural components, including two flagellin H-antigen (*Hag*) genes, and the two-component regulatory system, DegS/DegU (12). Using more stringent criteria (Methods), we defined 57 genes as most likely required for motility, including 27 genes homologous to genes not commonly associated with motility in Gram-positive bacteria and 7 genes encoding proteins of unknown function. In general, the highest-confidence 21 genes identified by MEAPS (Fig. 1E and Dataset S2) were homologous to genes previously associated with the assembly of flagella or the regulation of motility in bacteria (12). Overall, 102 genes were overrepresented among nonmotile strains, including 19% of genes identified as potential motility genes by keyword searches (Dataset S2). Strikingly, only 23% ($n = 24$) and 55% ($n = 56$) of these 102 genes were identified as potential motility genes by reciprocal BLAST homology and Pfam terms, respectively (Fig. 2A). These results imply that a significant fraction of genes predicted by bioinformatics to participate in *E. acetylicum* motility do not play a role in motility under the conditions tested. We also monitored intergenic regions (Fig. S4)

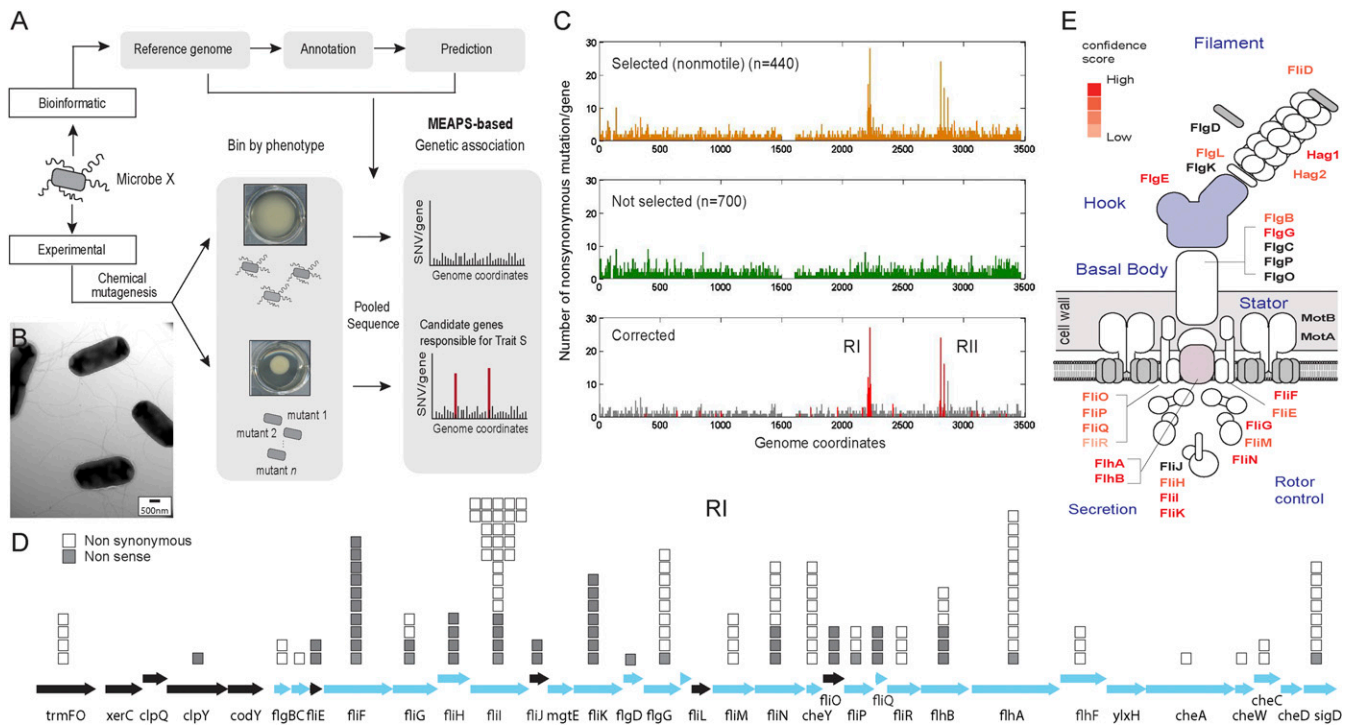


Fig. 1. Identification of genes required for motility in *E. acetylicum*. (A) Schematic of the approach coupling chemical mutagenesis and DNA sequencing to perform a MEAPS and identify genes required for swarming motility. (B) Transmission electron micrograph of *E. acetylicum* flagella. (Scale bar: 0.5 μm.) (C) MEAPS of *E. acetylicum* strains defective for motility. *E. acetylicum* mutants were selected based on the loss of swarming ($n = 440$) or not selected ($n = 700$), and their genomes were sequenced. The normalized frequency of nonsynonymous mutations reveals two chromosomal regions (RI and RII) that preferentially accumulate mutations in nonmotile *E. acetylicum* strains. Red bars highlight predicted motility genes based on their similarities to motility genes in other bacteria. (D) Genetic map of ORFs in motility region I. Genes with homology to predicted motility genes (Dataset S1) are shown as blue arrows, and the number of nonsense and nonsynonymous mutations identified, after correction, are represented by gray and white squares, respectively. (E) Cartoon schematic of the Gram-positive flagellar apparatus displaying all components conserved in *E. acetylicum*. Components identified by MEAPS are shown in different font colors to reflect confidence of their relative association with motility (Dataset S2).

indicate that mutations in *ea2862* and *ea2619* likely regulate the frequency and direction of motility as opposed to flagellar assembly or function. Consistent with this observation, the suppressor mutations we identified in the FlIM cluster in regions predicted to regulate interactions with FlIG and other motility regulators (25, 26) and potentially the ability for FlIM to self-assemble (27). Similarly, mutations in the homolog of the *B. subtilis* Ser/Thr kinase PrkC, which is linked to cell-wall metabolism (28), also emerged as common suppressors. Additional suppressors of *ea2619* included mutations in a lipoteichoic acid biosynthetic protein (LtaS2) and MprF, a phosphatidyl lysyl transferase, which are involved in maintenance of the cell envelope (29, 30). We speculate that cell-wall modifications in these strains alter the rotation capacities of the flagellum (Fig. 4B).

Some suppressor mutations were gene-specific. For instance, two independent amino acid changes in Ea2157, a PilZ domain protein predicted to bind c-di-GMP, specifically suppressed two independent nonsense mutations in *ea2862*. The N terminus of Ea2157 has homology to the YcgR family of proteins, which in enteric bacteria control chemotaxis and swimming velocity by interacting directly with stator proteins (25, 31). These findings confirm the important role of c-di-GMP in the regulation of flagellar motility in Firmicutes (32). In addition to GGDEF and EAL domains, Ea2862 also has a PAS domain that is predicted to sense small molecules such as metabolites and gases (33). Indeed, the automated PROKKA annotation program ascribed Ea2862 as a homolog of the oxygen-sensing protein DosP (34). In *B. subtilis*, loss of the EAL protein PdeH causes elevated levels of c-di-GMP that inhibit motility through the PilZ domain protein YpfA and the flagellar motor protein MotA (31, 35, 36). Aside from the EAL domains in Ea2862, this protein does not share any homology with its *B. subtilis* counterpart. The role of Ea2862, or Ea2157, in motility could have not been predicted solely on bioinformatic analysis and highlights the utility of MEAPS for the functional annotation of a microbial genome (Fig. 4B). We hypothesize that the role of Ea2862 in integrating multiple signals, through its PAS domain, to regulate c-di-GMP levels and motility is more complex than that performed by PdeH in *B. subtilis*. The observation that many *E. acetylicum* GGDEF/EAL proteins also have PAS domains is intriguing (Fig. 3B), given that this domain can bind diffusible signal factors, such as unsaturated fatty acids (37), to potentially regulate c-di-GMP signaling and intraspecies and interspecies cell communication in the intestine.

The paucity of experimental tools to manipulate bacterial genomes has emerged as a major roadblock to understand how

microbial communities assemble and influence human and environmental health. Here, we describe how coupling of chemical mutagenesis, phenotypic selection, suppression analysis, and genomic sequencing-based mutational mapping, can be applied to rapidly derive strong phenotype–genotype correlations in a microbe with no preestablished molecular genetic tools, leading to a functional annotation of previously uncharacterized genes. A similar conceptual framework has been proposed to explore gene function in the obligate intracellular pathogen *Chlamydia trachomatis* (38), for conservation in protein function in bacteriophages (39), and to identify genes required for magnetosome formation (40) and microbial drug resistance (41, 42). By extending the application of genomic sequencing to the large-scale analysis of suppressor mutations, we genetically confirmed the contribution of specific genes to a complex trait and further revealed functions for new proteins whose activity could not be inferred solely from sequence homologies. We anticipate that this approach will significantly improve our ability to define the molecular mechanisms by which any culturable bacterial species interacts with their environments, aid with genome annotations, and provide biological tools to probe the function of specific genes in complex microbial communities.

Methods

Genome Assembly and Prediction of Motility Genes. *Exiguobacterium* sp. strain ZWU0009 (6) was grown in brain heart infusion (BHI) broth (BD Biosciences) overnight at 30 °C, and genomic DNA was isolated with a DNeasy blood and tissue kit (Qiagen). The genome was sequenced with PacBio RS (Pacific Bioscience Inc.). PacBio reads were assembled with PacBio SMRT analysis software, by using the HGAP2 protocol. Subsequent gene annotation was performed with PROKKA (43). Potential motility genes were identified by using the terms “firmicutes” and “motility” in reciprocal BLAST searches and Pfam domains in the European Molecular Biology Laboratory–European Bioinformatics Institute database by using the keywords “motility,” “flagellar,” and “chemotaxis.” Redundancies in the retrieved set of protein sequences were removed by clustering with USEARCH8 (44).

Chemical Mutagenesis and Screening for Nonmotile *Exiguobacterium* Mutants.

E. acetylicum was mutagenized with 2.5–20 mg/mL EMS or *N*-ethyl-*N*-nitrosourea (ENU) (Sigma-Aldrich) in PBS for 1 h. Mutant bacteria were inoculated in 0.3% BHI agar plates. After overnight incubation, bacteria at the initial site of inoculation were collected and reinoculated in the center of another 0.3% agar plate to enrich for nonswarming mutants (45). After three rounds of enrichment, individual bacterial colonies were tested in a 96-well plating assay (46) to identify mutants that failed to swarm in low-percentage agar.

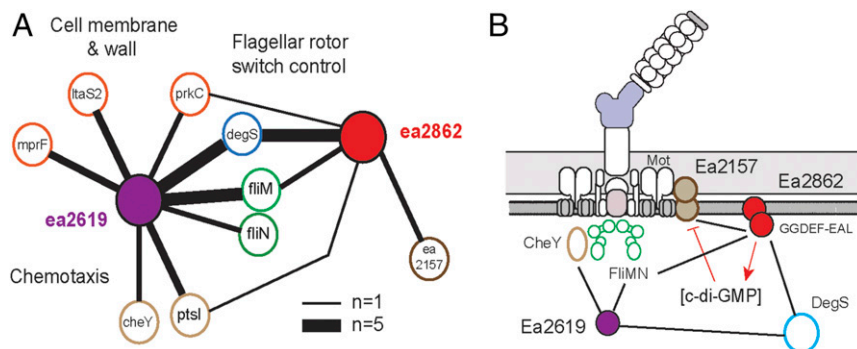


Fig. 4. Extragenic suppression analysis of nonmotile *E. acetylicum* mutants identifies a role for cell-wall modifications and c-di-GMP sensing in commensal Firmicutes motility. (A) Genetic suppressors of loss-of-function alleles in two novel motility genes reveal that loss of motility in mutants defective for *ea2619* and *ea2862* can be bypassed by changes in flagellar rotor switch control and chemotaxis. Motile variants of mutants bearing independent nonsense alleles of *ea2619* or *ea2862* were isolated. Common suppressor mutations (open circles) were mapped to chemotaxis genes (brown), rotor control genes (green), regulators of flagellar gene transcription (blue), and cell membrane homeostasis (orange). Thickness of lines connecting nodes is proportional to the number of independent suppressor mutations identified (Dataset S3). (B) Schematic of suppressor mutations linking Ea2619 and Ea2862 to the regulation of swimming speed and direction. Ea2157 indicate a direct link for the levels of c-di-GMP regulated by Ea2862 as central to the control of flagellar motility in *E. acetylicum* (red arrows). *ea2157* was independently identified by MEAPS as a putative motility gene.

Computational Modeling, Genomic Sequencing, and Mutational Enrichment Analysis. These methods and associated code for computational modeling are described in *SI Methods*.

Isolation of Spontaneous Suppressors of Nonmotile *E. acetylicum* Strains. Each nonmotile mutant strain was grown independently in BHI broth, placed in the center of 0.3% agar BHI plates, and incubated overnight. Bacteria at the edge of the growth zone were collected and reinoculated in the center of another 0.3% agar plate. The cycle was repeated until a clear enrichment for motile variants was observed.

Gnotobiotic Zebrafish Colonization. All zebrafish experiments were conducted in conformity with the Public Health Service Policy on Humane Care and Use of Laboratory Animals using protocols approved by the Institutional Animal Care and Use Committee of Duke University. Germ-free zebrafish were

reared in sterile tissue culture flasks. At 6 d postfertilization, overnight shaking cultures of *E. acetylicum* motile and nonmotile rifampin-resistant and -sensitive strains were mixed in 1:500 ratios. After 30 min of immersion in the *E. acetylicum* strain mixtures, animals were rinsed in growth medium. Bacterial loads were determined at 0 or 3 d postinoculation (dpi). The number of colony-forming units was assessed after overnight growth at 28 °C.

Other methods and statistical approaches are described in *SI Methods*.

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