

# Model-enabled gene search (MEGS) allows fast and direct discovery of enzymatic and transport gene functions in the marine bacterium *Vibrio fischeri*

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Whereas genomes can be rapidly sequenced, the functions of many genes are incompletely or erroneously annotated because of a lack of experimental evidence or prior functional knowledge in sequence databases. To address this weakness, we describe here a model-enabled gene search (MEGS) approach that (i) identifies metabolic functions either missing from an organism's genome annotation or incorrectly assigned to an ORF by using discrepancies between metabolic model predictions and experimental culturing data; (ii) designs functional selection experiments for these specific metabolic functions; and (iii) selects a candidate gene(s) responsible for these functions from a genomic library and directly interrogates this gene's function experimentally. To discover gene functions, MEGS uses genomic functional selections instead of relying on correlations across large experimental datasets or sequence similarity as do other approaches. When applied to the bioluminescent marine bacterium Vibrio fischeri, MEGS successfully identified five genes that are responsible for four metabolic and transport reactions whose absence from a draft metabolic model of V. fischeri caused inaccurate modeling of high-throughput experimental data. This work demonstrates that MEGS provides a rapid and efficient integrated computational and experimental approach for annotating metabolic genes, including those that have previously been uncharacterized or misannotated.

The development of next-generation sequencing technologies has generated thousands of genome sequences. These are primarily annotated by a combination of bioinformatics methods that are both fast and can be applied genome-wide. Homol-

ogy-based bioinformatics methods (e.g. BLAST) assume similar sequences share similar functions. Structure-based methods (1, 2) and genomic context-based methods (e.g. conserved operon, gene fusions, and gene co-occurrence across genomes (3-5)) can be utilized to infer functions that are difficult to annotate using BLAST alone. These bioinformatics methods are often used in conjunction with high-throughput experimental data (including gene expression, protein-protein interactions, mass spectrometry, RNAi, and mutant fitness) to suggest gene functions based on connections between genes with known and unknown functions. For example, recent studies have used correlations in transposon mutant-fitness scores across multiple experimental conditions to improve genome annotations (6). Despite the power of these bioinformatics methods, and the increasing availability of high-throughput data, 40-60% of newly sequenced genes still lack assigned functions (7-9). In addition, although bioinformatics methods can quickly predict specific gene functions, biochemical characterization must be still performed separately to validate those predictions. In fact, a majority of the gene functions assigned have no experimental evidence. For example, as of August 2016, only  $\sim$ 27% of the entries in the UniProtKB Swiss-Prot knowledgebase contain experimental evidence at the protein or transcript level (10). Direct experimental testing of gene functions that are proposed bioinformatically or based on high-throughput experiments is needed to reduce the high rate of incomplete and incorrect annotations (8, 11, 12). Such assessment is important because functions incorrectly assigned to gene sequences enter databases that are subsequently used to assign functions to new sequences. As a result, errors that are hard both to identify and to correct will propagate.

Consequently, it is crucial to develop approaches that quickly identify missing and/or erroneously assigned gene functions and to provide fast and direct experimental validation for the correct function. Such goals can be achieved by combining genome-scale metabolic modeling with experimental techniques. Genome-scale metabolic models are developed primarily based on genome annotations obtained from bioinformatics tools. Current model-based algorithms, including GapFill, SMILEY, and GrowMatch, can use cell culture data to pinpoint knowledge gaps caused by missing or incorrectly called gene functions; however, these algorithms cannot identify candidate genes for these functions (13–15). More recent algorithms,



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This article contains supplemental Excel files S1 and S2, Figs. S1–S7, Tables S1–S6, and Refs. 1–11.

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**Figure 1. Overview of MEGS.** In the first step, a metabolic model for an organism of interest is constructed. Target reactions, which are either missing from the model or assigned to the wrong genes, are inferred from discrepancies between model predictions and experimental measurements. A recipient strain (derived from a well-characterized organism, *e.g. E. coli*) and selective medium are then designed for each target reaction. Such recipient strains can only grow in the selective medium if they acquire heterologous enzymes that catalyze the target reaction. Finally, a genomic library is created, and the recipient strain is used to select for genes capable of catalyzing the target reactions, because such genes will enable growth of the recipient strain in the selective medium. The discovered genes can then be further characterized and added to the model to improve predictions.

including PHiller-GC, Model SEED, ADOMETA, and MIRAGE, identify missing metabolic reactions and candidate genes that might be responsible for catalyzing them (16-19), but these algorithms require additional data such as annotated sequences from other organisms and/or expensive gene-expression datasets that might not be available. Importantly, all of these current model-based approaches still do not provide direct experimental validation of the function of the candidate gene. Here, we propose a high-throughput model-enabled gene search (MEGS)<sup>2</sup> method that rapidly identifies functions for unannotated or misannotated genes. The metabolic modeling procedures in MEGS quickly generate a list of missing or erroneous functions in genome annotations derived from bioinformatics tools and design functional selection experiments (experiments where only strains that gain an essential function from a genomic library are able to grow) to select for genes with these functions. Subsequent functional selection experiments identify the responsible gene(s) from a genomic library and provide fast and direct experimental evidence for the gene's function. In contrast to metagenomic functional selections, which have been used to identify ribulose-bisphosphate carboxylase/ oxygenase, DNA polymerase, and antibiotic-resistance genes (20–22), MEGS' functional selections are based on knowledge gaps identified by metabolic modeling. By using genomic functional selections, MEGS does not rely on sequence similarity or genomic context to find gene functions and, as such, can be used to discover functions for previously uncharacterized groups of genes. As such, MEGS complements existing bioinformatics tools to improve genome annotations. MEGS was successfully used to identify the enzymatic and transport functions of five genes in *Vibrio fischeri*, which were subsequently confirmed by a combination of experiments involving complementation, mutant growth phenotyping, qPCR analysis, and enzyme assays.

#### Results

#### **Overview of MEGS**

MEGS involves three steps that combine metabolic modeling and experimentation (Fig. 1). First, a genome-scale metabolic model of an organism of interest is developed, and physiological experiments are performed to validate the model. Computational tools (14, 15) are then used to pinpoint metabolic function(s) that are missing from the model but are needed to resolve model data discrepancies. The physiological experiments suggest these missing functions occur, but the discrepancies between model predictions and experiments indicate that the functions are absent from current genome annotations. For example, the *V. fischeri* model originally lacked genes involved in catabolism of both D-xylose and mannitol; however,



<sup>&</sup>lt;sup>2</sup> The abbreviations used are: MEGS, model-enabled gene search; qPCR, quantitative PCR; DMM, defined minimal medium; FBA, flux-balance analysis; DC, decarboxylase; PEPC, phosphoenolpyruvate carboxylase; MDH, malate dehydrogenase; KEGG, Kyoto Encyclopedia of Genes and Genomes.



Figure 2. Pathways missing reactions and genes in V. fischeri. a, aspartate 1-decarboxylase (panD in E. coli), involved in pantothenate and coenzyme A biosynthesis, is missing in V. fischeri. b, mannitol 1-phosphate 5-dehydrogenase (mtlD in E. coli), involved in mannitol catabolism, is missing in V. fischeri. c, transporters for N-acetylneuraminate (nanT in E. coli) (c) and glutamine (glnHPQ in E. coli) (d) are missing in V. fischeri.

only genes involved in mannitol catabolism were identified by the model as missing because V. fischeri grew on mannitol (but not D-xylose) as a sole carbon source. Second, a recipient strain (derived from a well-characterized organism, e.g. Escherichia coli) and selective medium (e.g. a minimal medium supplemented with a single carbon source) are designed such that the recipient strain can only grow in the selective medium if the gene(s) presumptively encoding the missing metabolic function (from the organism of interest) is transferred to the recipient strain. Such pairs of recipient strains and selection media can be computationally designed for a reaction of interest using a forced coupling algorithm (23). Third, a genomic functional selection experiment is performed to locate the gene(s) in the genome that are responsible for the missing metabolic function and provide direct evidence for the gene's function. For this last step, a genomic library of the organism of interest is created by inserting random genomic DNA fragments into plasmids. This plasmid library is then transformed into the recipient strain. Gene(s) responsible for the missing metabolic function can then be identified by sequencing plasmids that complement growth of recipient strains in the selective medium. The discovered genes can then be further characterized and added to the model to improve predictions. As more experimental data are generated, any new model data discrepancies that arise can be used to drive additional MEGS cycles.

#### MEGS applied to discover V. fischeri gene functions

In this work, we applied MEGS to discover and characterize several enzyme- and transporter-encoding genes of *V. fischeri* ES114, which is a bioluminescent marine bacterium that forms a symbiotic relationship in the light-emitting organ of the Hawaiian bobtail squid, *Euprymna scolopes* (24). Its metabolic capabilities are representative of many other marine bacteria, including both beneficial and pathogenic members of the *Vibrio* genus, and are thus of particular interest (25). From the KEGG (Kyoto Encyclopedia of Genes and Genomes)-annotated genome, we reconstructed a genome-scale metabolic

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model for V. fischeri ES114, named iVF846 (supplemental Excel file S1). Reactions and metabolites from an E. coli model, iJO1366 (26), were transferred into the draft model of iVF846 when orthologs to E. coli metabolic genes were found in V. fischeri. The draft iVF846 model was then curated based on the following: (i) data and information reported in the literature, and (ii) new growth-phenotyping experiments using Biolog plates, a method for individually testing the ability to metabolize 96 different carbon sources using a microtiter dish format. To facilitate model curation, a modified version of the SMILEY (14) algorithm (see under "Experimental procedures") was used to identify missing enzymatic or transport reactions that, if added to the model, would resolve discrepancies between model predictions and experimental growth phenotypes of V. fischeri ES114 wild type and mutants. This analysis identified that V. fischeri was missing an annotated aspartate 1-decarboxylase (encoded by panD in E. coli), which caused the draft model to predict no growth either in LBS or in a V. fischeri defined minimal medium (DMM) (Fig. 2a). The growth-phenotyping experiments were performed to identify sole carbon sources that support growth of V. fischeri (see under "Experimental procedures"). These results (supplemental Excel file S2) were compared with model-predicted sole carbon sources using flux-balance analysis (FBA) (27), and discrepancies were found for mannitol and N-acetylneuraminate. The modified SMILEY algorithm predicted that mannitol 1-phosphate 5-dehydrogenase (encoded by mtlD in E. coli) and an N-acetylneuraminate transporter (encoded by *nanT* in *E. coli*) were missing from the draft model (Fig. 2, b and c). Finally, FBA was used to predict essential V. fischeri genes in LBS medium, and gene essentiality predictions were compared with a recent transposon insertion study (supplemental Table S1) (28). One false-positive prediction was for glutamine synthase (VF\_0098), where the model predicted the gene was essential but experimentally it was found to be non-essential. Based on this discrepancy, the modified SMILEY algorithm predicted the draft model was missing glutamine transporter(s) (Fig. 2d).





Figure 3. Growth coupling of a recipient strain to a missing metabolic function in selective medium. Growth dependence for each recipient strain in selective medium was calculated using iJO1366 (26). Feasible combinations of growth rate and a missing metabolic enzyme are shown in *blue*. In all cases, cell growth is not zero only when there is flux through the reaction on the *y* axis (because no non-trivial solutions exist on the *x* axis). The flux limits of oxygen and carbon uptake rates were set at 10 mmol/g dry weight (*gDW*) per h. *a*, aspartate 1-decarboxylase activity (associated with *panD* in iJO1366) is coupled to growth of a  $\Delta panD$  mutant in glucose minimal medium. *b*, mannitol 1-phosphate 5-dehydrogenase activity (associated with *mtlD* in iJO1366) is coupled to growth of a  $\Delta mtlD$  mutant in mannitol minimal medium. *c*, *N*-acetylneuraminate transport (ACNAMt2pp associated with *panT* in iJO1366) is coupled to growth of a  $\Delta nanT$  mutant in *N*-acetylneuraminate minimal medium. *d*, glutamine transport (GLNabcpp associated with *glnHPQ* in iJO1366) is coupled to growth in a double knock-out  $\Delta glnP\Delta ansB$  in glutamine minimal medium. The *ansB* was not deleted experimentally because it has a low activity with glutamine (66), and  $\Delta glnP$  mutants (67, 68) were previously shown to be unable to grow on glutamine.

To experimentally identify the V. fischeri genes encoding the missing aspartate 1-decarboxylase, and mannitol 1-phosphate 5-dehydrogenase, as well as transporters for N-acetylneuraminate and glutamine, a specific *E. coli* recipient strain and selective medium were designed for each missing metabolic function (supplemental Table S2). The iJO1366 metabolic model was used to demonstrate in silico that the growth of each E. coli recipient strain requires the specified missing metabolic function in selective medium (Fig. 3, a-d). Here, recipient *E. coli* strains were used because their metabolism is well characterized, and knock-out mutant collections are available (29, 30). For clarity, we will refer to the well-characterized *E. coli* genes using their gene symbols and V. fischeri genes using their locus tags. The locus tags of the E. coli genes are listed in supplemental Table S2. A 53-gigabase pair V. fischeri genomic library with  $\sim$ 12,000-fold genome coverage was created and transformed into the recipient strains:  $\Delta panD$ ,  $\Delta mtlD$ ,  $\Delta nanT$ , and  $\Delta glnP$ . After growth selection in each recipient strain's selection media, we found that plasmids expressing VF\_0892, VF\_A0062, and VF\_0668 rescued  $\Delta panD$ ,  $\Delta mtlD$ , and  $\Delta glnP$ , respectively,

and plasmids independently expressing either VF\_0924 or VF\_1172 rescued  $\Delta glnP$ .

#### Functional complementation in recipient strains

We individually cloned VF\_0892, VF\_A0062, VF\_0668, VF\_0924, and VF\_1172 into an empty vector because plasmids in the genomic library can contain fragments that encode more than one gene. All transformed single-gene plasmids enabled growth of recipient strains in the corresponding selective medium (Fig. 4, a-d). This result demonstrated that these genes complemented recipient-strain growth and thus are functionally equivalent to the analogous *E. coli* genes. In the experiments with the glutamine transporter, glutamine was supplied as the sole carbon source. Wild-type *E. coli* grows poorly on glutamine as a sole carbon source due to low uptake rates (31). Overexpression of either VF\_0924 or VF\_1172 in the *E. coli*  $\Delta glnP$  resulted in a faster growth rate compared with the wild-type *E. coli* strain expressing an empty-vector control (Fig. 4*d*).





Figure 4. Plasmids expressing the MEGS-discovered V. fischeri genes enabled growth of recipient strains. Each panel shows the growth curves for the recipient strain listed at the *top* of each panel. Each *solid line* represents  $A_{600}$  over time, and the associated colored transparent shade indicates the range of standard deviations across biological replicates (n = 3). The selective medium used for each panel was a MOPS minimal medium supplemented with 20 mM glucose (a), 20 mM mannitol (b), 20 mM A-acetylneuraminate (c), and 20 mM glutamine and vitamin supplements (0.05 mM thiamine, 0.05 mM niacinamide, and 20 nM biotin) (d). Blue lines represent growth of the parent BW25113 with an empty pZE21MCS vector. Green lines represent growth of the listed recipient strains ( $\Delta panD$ ,  $\Delta mtlD$ ,  $\Delta nanT$ , or  $\Delta glnP$ ) with an empty pZE21MCS vector. Yellow and purple lines represent growth of recipient strains that contain pZE21MCS plasmids expressing the listed V. fischeri gene. d, yellow line represents  $\Delta glnP$  + pZEVF0924 strain, and the purple line represents  $\Delta glnP$  + pZEVF1172.

# Functional complementation in the organism of interest, V. fischeri

The  $\Delta VF_{0892}$ ,  $\Delta VF_{A0062}$ , or  $\Delta VF_{0668}$  V. fischeri knockout mutants did not grow in minimal medium (similarly to the selective medium, where DMM instead of MOPS minimal medium was used); however, the V. fischeri knock-out mutants were complemented by plasmids expressing wild-type copies of VF\_0892, VF\_A0062, or VF\_0668, respectively (Fig. 5, *a*-*c*). In addition, the  $\Delta VF_{0892}$  mutant could grow in glucose minimal media if supplemented with pantothenate and/or  $\beta$ -alanine (supplemental Fig. S1). Better growth of this mutant was observed with addition of 10 mM pantothenate compared with 10 mM  $\beta$ -alanine, possibly due to a slower  $\beta$ -alanine uptake. However, the transporter(s) in *V. fischeri* for  $\beta$ -alanine and pantothenate are, as yet, unknown. The  $\Delta VF_{0924} \Delta VF_{1172}$ double mutant still grew in DMM supplemented with glutamine as the sole carbon source, indicating the existence of other V. fischeri glutamine transporters in the genome. We tested whether VF\_1172 (annotated as a tyrosine-specific transporter) can also transport leucine, by evaluating growth of *E. coli* BW25113 with a plasmid overexpressing VF\_1172 in minimal medium supplemented with glucose and leucine (supplemental Fig. S2). Overexpression of VF\_1172 slowed growth in media supplemented with leucine, a phenotype that can be attributed

to leucine toxicity that was previously observed in an *E. coli* K-12 strain overexpressing branched-chain amino acid transporters (32). Like VF\_1172, other amino acid transporters of *V. fischeri* might have broad substrate specificity.

#### Detection of $\beta$ -alanine using in vitro enzyme assays

To further confirm the enzymatic function of VF\_0892, we purified a His<sub>6</sub>-tagged VF\_0892 protein and tested its functionality as an aspartate 1-decarboxylase in vitro. Only the reaction condition that contained both aspartate and the VF\_0892 enzyme was able to produce  $\beta$ -alanine from aspartate (12.7  $\pm$ 0.8 nmol, where reported error is the standard deviation across three biological replicates). In contrast, conditions containing aspartate alone, VF\_0892 enzyme alone, aspartate and heatinactivated VF\_0892 enzyme, or aspartate and proteins purified from cells containing the empty vector did not produce any detectable  $\beta$ -alanine (less than 0.125 nmol). Proteins purified from cells containing the empty vector were used as a control to provide information of contaminant proteins (supplemental Fig. S3a). These *in vitro* enzyme assays further confirmed that VF\_0892 (1644 bp) can catalyze the conversion of aspartate to  $\beta$ -alanine and thus is functionally equivalent to *panD* (381 bp) despite their sequence dissimilarity (i.e. BLAST found no significant similarity between the two proteins).

# Kinetic characterization of PanD, VF\_0892, and VF\_1064 enzymes

VF\_0892 is currently annotated in NCBI as a glutamate decarboxylase (EC 4.1.1.15). To compare the activity and substrate specificity of VF\_0892 and E. coli PanD toward the two potential substrates (aspartate and glutamate), decarboxylase activities (supplemental Fig. S3b) were evaluated using the DC-PEPC-MDH-linked assays at pH 8.05. Here, the kinetic parameters were determined from three technical replicates and are reported as an average  $\pm$  S.E. The  $k_{cat}$  and  $K_m$  values of the VF\_0892 enzyme were 0.075  $\pm$  0.04  $\mu$ M CO<sub>2</sub>/ $\mu$ M enzyme-sec and 1.44  $\pm$  0.35 mM, respectively, at 28 °C, and 0.008  $\pm$  0.001  $\mu$ M CO<sub>2</sub>/ $\mu$ M enzyme-sec and 1.70  $\pm$  0.56 mM, respectively, at 37 °C (Fig. 6a). The VF\_0892 enzyme was around 10-fold more active at 28 °C compared with 37 °C. Precipitation of purified VF\_0892 enzyme was observed over time at 37 °C. Greater activity at 28 °C is consistent with the optimal growth of V. fischeri at 28 °C and its intolerance to higher temperatures. E. coli PanD showed a  $k_{cat}$  of 0.008  $\pm$  0.001  $\mu$ M CO<sub>2</sub>/ $\mu$ M enzyme-sec and  $K_m$  of 1.44  $\pm$  0.33 mM at 37 °C (Fig. 6b). However, it is possible that not all of the purified PanD was post-translationally processed into its active form, resulting in a low  $k_{cat}$ . Both PanD and the VF\_0892 enzyme showed a much higher reaction rate when aspartate, rather than glutamate, was used as the substrate (PanD, 10-fold; VF 0892, 5-fold at 37 °C, and 26-fold at 28 °C, Fig. 6c).

In addition to VF\_0892, another *V. fischeri* gene (VF\_1064) is currently annotated as a glutamate decarboxylase. Based on BLASTP, VF\_1064 has 21% identity to VF\_0892 with an E-value of 0.38 but 58% identity and an E-value of 0.0 to the *E. coli* glutamate decarboxylase *gadB*. We evaluated experimentally whether VF\_1064 decarboxylates glutamate and/or aspartate. In the DC-PEPC-MDH-linked assays, the purified VF\_1064





**Figure 5. Plasmids expressing V. fischeri genes complemented growth of V. fischeri knock-out mutants.** Each panel shows the growth curves for a V. fischeri mutant complemented with an empty vector or vector expressing the deleted gene. The gene listed at the top of each panel indicates the gene deleted in the mutant and expressed in the complementation plasmid. Each solid line represents A<sub>600</sub> over time, and the associated colored transparent shade indicates the range of standard deviations across biological replicates (n = 3). The medium used in each panel was the DMM minimal medium supplemented with (a) 20 mM glucose, (b) 20 mM mannitol, or (c) 20 mM *N*-acetylneuraminate. Blue lines represent growth of V. fischeri ES114 with an empty pVSV105 vector. Green lines represent growth of the V. fischeri knock-out mutants (ΔVF\_0892, ΔVF\_A0062, and ΔVF\_0668) with an empty pVSV105 vector. Yellow lines represent growth of V. fischeri knock-out mutants carrying a pVSV105 plasmid expressing the corresponding V. fischeri gene (e.g. ΔVF\_0892) + pVF0892).



Figure 6. Kinetic characterization and substrate specificity of the *E. coli* **PanD and the VF\_0892 (PanP) enzymes.** Average reaction rates ( $\Delta AU$  units/min) are shown for three technical replicates of the DC-PEPC-MDH-linked assays performed at the specified aspartate or glutamate concentration with standard deviations shown as the *error bars. a*, reactions rates with the VF\_0892 enzyme at various concentrations of aspartate at either 28 °C (*gray*) or 37 °C (*blue*). *Solid lines* show the nonlinear fitting to the Michaelis-Menten equation using KaleidaGraph. *b*, reaction rates of PanD at various concentrations of aspartate at 37 °C. *c*, reaction rates of PanD with a concentration of 8 mM of either glutamate or aspartate and reaction rates of the VF\_0892 enzyme with a concentration of 9 mM of either glutamate or aspartate at either 28 or 37 °C.

enzyme (supplemental Fig. S3*b*) showed about a 20-fold higher reaction rate with 10 mM glutamate than with 10 mM aspartate (supplemental Fig. S4*a*). With glutamate at pH 8.05 and 37 °C, VF\_1064 exhibited a  $k_{cat}$  of  $0.055 \pm 0.037 \ \mu M \ CO_2/\mu M$  enzymesec and  $K_m$  of  $61.7 \pm 46.4 \ mM$  (supplemental Fig. S4*b*). Because of the solubility of glutamate, we were not able to test the enzyme kinetics of VF\_1064 at glutamate concentrations at or greater than its  $K_m$  value, resulting in large standard errors for  $k_{cat}$  and  $K_m$ . A pH of 8.05 was used to keep CO<sub>2</sub> produced by the decarboxylase primarily as HCO<sub>3</sub><sup>-</sup>, but this pH might not be optimal for VF\_1064 because *E. coli* GadB is most active at pH 3.8 (33). Additional experimental evidence suggests that VF\_1064 cannot function as an aspartate 1-decarboxylase; specifically, only VF\_0892, and not VF\_1064, is essential in LBS medium (28). Also, the single gene plasmid expressing VF\_1064

did not complement the  $\Delta panD E$ . coli mutant in the selective medium, whereas the plasmid expressing VF\_0892 did (supplemental Fig. S5 and Fig. 4*a*).

Based on the measured substrate preferences for the VF\_0892 and VF\_1064 enzymes, we conclude that VF\_0892 is associated with the aspartate 1-decarboxylase reaction, whereas VF\_1064 is only associated with the glutamate decarboxylase reaction in the *V. fischeri* model.

# Growth and VF\_A0062 expression in wild-type V. fischeri using sole carbon sources

Using MEGS, we identified VF\_A0062, a gene currently annotated as dehydrogenase, as a mannitol 1-phosphate 5-dehydrogenase. Here, we provide more evidence that VF\_A0062 is involved in mannitol and not L-sorbose utilization. VF A0062 has significant similarity to genes annotated as L-sorbose 1-phosphate reductases in other Vibrio species, including Vibrio rotiferianus and Vibrio owensii (BLASTP E-value = 0, amino acid identity >88%). In addition to the high-throughput growth-phenotyping assays, we confirmed in shake flasks that L-sorbose does not support growth of wildtype V. fischeri as a sole carbon source, although mannitol and glucose do (supplemental Fig. S6). qPCR analysis showed a 6.5fold increase in expression of VF\_A0062 in the mannitol minimal medium compared with the glucose minimal medium. (A relative expression ratio of 6.5  $\pm$  2.3 was calculated from three biological replicates. The reported error is the standard deviation). In some other Vibrio species, e.g. Vibrio cholerae and Vibrio metoecus, which do not contain a gene similar to VF\_A0062, an ortholog of *mtlD* is present in their genomes instead. Therefore, Vibrio species apparently contain a mannitol 1-phosphate 5-dehydrogenase that is similar to either *mtlD* in E. coli or VF\_A0062 in V. fischeri.

#### Squid light-organ colonization phenotypes

We further tested whether *V. fischeri* knock-out mutants ( $\Delta VF_0892$ ,  $\Delta VF_A0062$ ,  $\Delta VF_0668$ , and  $\Delta VF_0924\Delta VF_172$ ) could successfully colonize the squid light organ in competition with a wild-type strain (we excluded VF\_0892 due to its inability to grow in LBS medium without supplementation of  $\beta$ -alanine or pantothenate). We observed no significant colonization phenotypes in our knock-out mutants during the initial

stage of colonization (24 h after inoculation) (supplemental Fig. S7). However, VF\_A0062 and VF\_0668 might play a role in persistence after colonization because transposon insertions in either VF\_A0062 or VF\_0668 failed to persist in the squid when competing with a pool containing other transposon library mutants and the wild type (after 48 h of colonization) (28).

#### Discussion

In this work, we developed MEGS to improve gene annotations by combining metabolic modeling with genomic functional selection. Computational models, built from an existing genome annotation, were used to identify missing or incorrect annotations in the current genome annotation and to design selections (using other organisms) for genes responsible for these missing functions. We successfully identified five genes responsible for four metabolic functions that were missing from our draft V. fischeri metabolic model. Using MEGS, we provided the first experimental evidence that (i) VF\_0892 functions as an aspartate 1-decarboxylase; (ii) VF\_A0062 functions as a mannitol 1-phosphate 5-dehydrogenase; (iii) VF\_0668 functions as an N-acetylneuraminate transporter, and (iv) VF\_0924 and VF\_1172 function as glutamine transporters. Importantly, none of these genes are orthologous to the E. coli genes with the same functions. These discoveries improved the quality of the V. fischeri genome-scale metabolic model, iVF846, which has been used in studying V. fischeri metabolism and its symbiotic relationship in the squid light organ, especially during the habitat transition between seawater and the symbiotic niche (34).

MEGS leverages both computational and experimental techniques to provide functional annotations for genes encoding enzymes and transporters. Metabolic genes are responsible for the physiological and biochemical states of a cell, and knowledge of their functions is critical for understanding and controlling cell behavior. By taking advantage of metabolic modeling, MEGS identifies errors and omissions in existing genome annotations due to either a lack of experimental evidence or prior knowledge in databases and designs experiments to correct these errors. Because MEGS uses genomic functional selections to find genes instead of sequence similarity or genomic context, it can discover genes with unique sequences and/or genes that have not been studied in the laboratory. MEGS is experimentally and computationally inexpensive and efficient. A draft genome-scale metabolic model can be prepared automatically using available software platforms in only a few hours (17, 35-37). Metabolic reactions missing from such a draft model or associated with the wrong genes, as well as genomic functional-selection strategies, can also be identified within a few hours (23). The genomic library used in our method (which takes 2 days to construct) contains information from across the entire genome, so that all the genes in the library go through the selection simultaneously. Once a library is created, MEGS cycles can be repeated to search for additional genes associated with different missing reactions. Similarly, once a recipient strain is constructed, it can be used to select for genes responsible for a particular metabolic reaction from multiple genomes (using separate genomic libraries). The time required to build the recipient strains depends on the number of gene additions and deletions needed; however, this time can be significantly reduced by using existing mutant strain collections (29, 38, 39). Functional selection from the genomic library via growth complementation of the recipient strain in a selective medium is fast (1–3 days) and also provides direct experimental evidence of gene functions. One cycle of the entire MEGS process can be completed within a week using existing recipient strain collections.

MEGS offers an alternative and complementary approach to bioinformatics-based methods for predicting gene functions. In retrospect, some of the genes we identified using MEGS are also top-scoring candidates that have been or could be derived bioinformatically using various genomic context-based methods. VF\_0892 was already tentatively suggested to be a member of the pyridoxal-dependent aspartate 1-decarboxylases (TIGR03799) by partial phylogenetic profiling (29). This protein family was given a suggested name of PanP, to distinguish it from a non-orthologous family of aspartate 1-decarboxylase (PanD TIGR00223), which is pyruvoyl-dependent and more widely distributed than PanP. PanP is present in a number of marine bacteria (a list of all proteins that belong to TIGR03799 are listed in supplemental Table S3); however, no direct experimental evidence was available previously to support its annotation as an aspartate 1-decarboxylase. We found that PanP was not properly incorporated in six manually curated genomescale metabolic models. Five of the models included an aspartate 1-decarboxylase reaction without any associated genes (40, 41) and one associated PanP with L-cysteate, 3-sulfino-L-alanine, glutamate, and aspartate decarboxylase reactions (42). Similarly, VF\_A0062 could have been predicted as a mannitol 1-phosphate 5-dehydrogenase candidate using bioinformatics methods because it is located in the same operon as yggD (VF\_A0063), and YggD has been characterized as a mannitol operon repressor in Shigella flexneri (34). VF\_0668 is a predicted member of SiaR regulon (controlling sialic acid degradation) according to the RegPrecise database (43), and it was tentatively annotated as a possible sialic acid transporter (permease), NanT. The SiaR regulon in Haemophilus influenzae includes a different tripartite ATP-independent periplasmic transporter (44). However, the function of the V. fischeri NanT has not yet been experimentally characterized.

Similar to operon- and regulon-based bioinformatics methods, MEGS does not depend on sequence similarity to wellcharacterized genes. Annotations based solely on sequence similarity may lack detailed functions when the unknown sequence is not similar to a characterized gene (*e.g.* conserved hypothetical proteins) or may be incorrect if the gene is similar to a gene that is incorrectly annotated in sequence databases. In the case of VF\_A0062, we demonstrated that this gene actually encodes a mannitol 1-phosphate 5-dehydrogenase even though it shares high sequence similarity with other annotated L-sorbose 1-phosphate reductase genes.

MEGS and bioinformatics-based approaches have different strengths and limitations and, as a result, can complement each other. For example, MEGS can complement bioinformaticsbased approaches when top-scoring candidates do not exist. Sometimes correlations between genes with unknown function and genes with known functions may not exist, and such corre-



lations can still lead to erroneous and/or nonspecific function assignments using bioinformatics methods alone (8). Another strength of MEGS compared with the bioinformatics-based approach is that genes identified from MEGS already have direct experimental evidence for their functions from the genomic-library selection experiments, while bioinformaticsderived gene functions must be tested in subsequent experiments. MEGS can be applied to organisms for which there are currently no genetic tools, opening up ways to evaluate their gene functions experimentally in another host. Some limitations of MEGS include the following: (i) it requires heterologous expression in the recipient strain, which might not be optimal; (ii) the recipient strains might be difficult to construct (e.g. essential genes cannot be deleted unless growth can be complemented by nutritional supplementation); and (iii) if multiple genes are responsible for a missing metabolic function, they must be co-localized on the chromosome. Additionally, MEGS might identify genes with low promiscuous activities that, when overexpressed, can complement growth defects associated with essential metabolic functions. Recent approaches for improving heterologous gene expression (45) and conditional mutation systems (46) are likely to help overcome some of these limitations. Ultimately, more detailed biochemical characterization of enzymes identified using bioinformatics or MEGS might be needed to confirm the physiological functions of gene products. However, these computational and experimental approaches are useful for identifying which genes to evaluate biochemically.

As more genome sequences become available, we speculate that MEGS will be successfully applied to further discover the roles of uncharacterized genes and improve our understanding of metabolism in a variety of both familiar and uncharacterized microorganisms. Newly discovered gene functions will propagate through genome databases as they are used by other existing approaches to improve annotations of genes in additional organisms.

#### **Experimental procedures**

#### In silico modeling

A newly constructed genome-scale metabolic model of V. fischeri strain ES114, iVF846, was used in this work (supplemental Excel file S1). Reactions and metabolites from an *E. coli* model, iJO1366 (26), were transferred into the draft model of iVF846 when orthologs to E. coli metabolic genes were found in V. fischeri. By our definition, the orthologous genes shared the KEGG ortholog identifier and were best reciprocal hits in the KEGG Sequence Similarity Database. The model contains 846 genes and 1583 reactions. FBA (27) was used to calculate the growth rate of V. fischeri by maximizing flux through a defined biomass objective function. In FBA, the minimal or rich medium was simulated by giving negative values to the lower limits for the exchange fluxes of the medium components in the model (supplemental Table S4 lists negative exchanges used for different simulations). A carbon source was predicted to be a sole carbon source if the FBA-predicted growth rate was greater than zero in minimal medium supplemented with this carbon source. To simulate a knock-out strain, the fluxes of metabolic

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reactions associated with the gene were fixed at zero, unless isozymes were present. A gene was predicted as essential if the FBA-predicted growth rate of the strain containing a single gene deletion was zero. A modified version of the mixed integer linear programming algorithm, SMILEY (14), was used to predict missing metabolic genes (and their associated reactions) when the model incorrectly predicted wild-type or mutant *V. fischeri* strains cannot grow in a particular medium. The algorithm was modified from its original implementation by minimizing the total number of metabolic genes (instead of reactions) that need to be added from iJO1366 (26) (instead of KEGG) to the *V. fischeri* model to enable growth and reconcile false predictions.

#### Strain construction

Wild-type *E. coli* BW25113 and wild-type *V. fischeri* ES114 were used in this work. *E. coli* knock-out strains (derived from BW25113) containing kanamycin resistance genes were obtained from the Keio collection (Open Biosystems) (29, 30). The temperature-sensitive plasmid pCP20 was used to remove the *kan* gene from the mutants as described previously (47). The resulting kanamycin-sensitive *E. coli* knockout strains were used as recipient strains for the *V. fischeri* genomic library. Knock-out mutants of *V. fischeri* ES114 were constructed using conjugation and homologous recombination as described previously (48–51). To construct  $\Delta VF_0892$ , 10 mM pantothenate and 10 mM  $\beta$ -alanine were supplemented in the LBS growth medium. All strains used in this study are reported in supplemental Table S5.

#### Plasmid construction for single-gene complementation

For *E. coli* complementation experiments, a single *V. fischeri* gene was cloned into the multiple cloning site of pZE21MCS (EXPRESSYS) using Gibson cloning. The construct was transformed into the corresponding *E. coli* knock-out strains, and colonies were selected on LB agar containing 50  $\mu$ g of kanamycin per ml. For *V. fischeri* complementation experiments, a single *V. fischeri* gene was cloned into the multiple cloning site of pVSV105 (52) using Gibson cloning. These plasmids containing a *V. fischeri* gene were introduced into *V. fischeri* ES114 knock-out strains by conjugation. All plasmids used in this work are listed in supplemental Table S5.

#### Growth conditions and complementation experiments

Unless otherwise noted, *E. coli* strains were grown at 37 °C, and *V. fischeri* strains were grown at 28 °C, both with shaking at 225 rpm. *E. coli* strains were grown in Luria-Bertani (LB) or a MOPS-buffered minimal medium (53). Because *E. coli* grows poorly on glutamine as a sole carbon source, vitamin supplements (0.05 mM thiamine, 0.05 mM niacinamide, and 20 nM biotin) were added to the minimal medium to shorten the experiments in which the glutamine transporter is complemented. *V. fischeri* strains were grown in Luria-Bertani salt (LBS) (24) or *V. fischeri* DMM (supplemental Table S6). Overnight cultures of  $\Delta VF_0$ 892 were grown in LBS supplemented with 10 mM pantothenate and 10 mM  $\beta$ -alanine. When appropriate, 50  $\mu$ g of kanamycin or 5  $\mu$ g of chloramphenicol per ml was added to the media. For complementation experiments, an



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overnight LB (or LBS) culture of each strain was subcultured by  $\sim$ 1:100 dilution into fresh minimal medium with a starting absorbance of 0.02 at 600 nm ( $A_{600}$ ). The  $A_{600}$  of the culture in a 96-well plate was measured by an Infinite M200 plate reader (Tecan) every 15 min with 3-mm orbital shaking. In complementation experiments with a VF\_0892 plasmid in  $\Delta panD$  or  $\Delta VF_0892$ , an overnight LB (or LBS) culture of each strain was washed twice in minimal medium and subcultured by 1:100 dilution into fresh minimal medium. Once the subculture grew to about mid-exponential phase, it was washed twice and subcultured again into fresh minimal medium for the growth curve measurements. All experiments testing a VF\_A0062 plasmid were performed at 28 °C, because pZEVFA0062 did not complement  $\Delta mtlD$  well when grown at 37 °C.

#### Growth-phenotyping experiments

To test sole carbon sources of *V. fischeri*, *V. fischeri* strain ES114 was grown in inoculating fluid supplemented with 255 mM sodium chloride, on PM1 or PM2A plates containing single carbon sources (Biolog) according to the manufacturer's protocol. The plates were incubated at 28 °C in an OmniLog incubator reader (Biolog), and turbidity was measured every 15 min for 48 h. The increase in turbidity was compared with a negative control with no added carbon source to determine whether cells grew. Additional experiments were performed in 17 × 100-mm test tubes to confirm growth of strains on a carbon source of interest or to detect strains with an intermediate increase in turbidity.

#### Genomic library construction

The genomic DNA of V. fischeri ES114 strain was extracted from LBS culture using the DNeasy Blood and Tissue kit (Qiagen). The extracted DNA was then fragmented at 10% amplitude for 5 s using the Sonic Dismembrator Model 500 (Thermo Fisher Scientific). DNA fragments between  $\sim 2$  and  $\sim 5$  kbp were size-selected from a 1% agarose gel in Tris acetate/EDTA buffer and purified with the Zymoclean Gel DNA Recovery kit (Zymo). The DNA fragments were ligated into the HinCII site of the multiple cloning site of the pZE21MCS1 vector and transformed into 50 µl of E. coli MegaX suspension (Invitrogen) following the protocol of Forsberg et al. (22). The average insert size of the library was  $\sim$ 2.3 kilobase pairs, and the titer of the library was 22 million colony forming units (CFUs). Transformed cells were transferred to 10 ml of LB containing 50 µg of kanamycin per ml and grown overnight. The overnight culture was used to extract the library of plasmids using the QIAprep Spin Miniprep kit (Qiagen).

#### Gene selection from a V. fischeri genomic library

The *V. fischeri* genomic library was transformed into competent cells of an *E. coli* recipient strain and recovered in 1 ml of Super Optimal broth with Catabolite repression (SOC) medium for an hour. The recovered cells were then pelleted at 6000 rpm for 3 min and transferred to 50 ml of selective medium (listed in supplemental Table S2) with 50  $\mu$ g of kanamycin per ml to grow at 37 °C. After the  $A_{600}$  reached 1, the cells were subcultured into 50 ml of fresh selection medium. After the  $A_{600}$  of the cells reached 1 again, they were plated on LB plus kanamycin plates. Single colonies were picked to confirm growth in selective medium, and the first and last 700 bp of the plasmid inserts were subsequently sequenced to identify the *V. fischeri* gene(s) included in the plasmid.

#### Expression and purification of decarboxylases

E. coli panD (b0131), V. fischeri panP (VF\_0892), and V. fischeri gadA (VF\_1064) were amplified from the genomic DNA using Phusion High-fidelity DNA Polymerase (New England Biolabs). The PCR fragments containing VF\_0892 were digested with NcoI and XhoI and cloned into pET28 (Novagen). The resulting plasmid pETVF0892 was transformed into E. coli X90(DE3) competent cells (54). The PCR fragments containing b0131 or VF\_1064 were inserted into the pET28 vector with an N-terminal His-tag sequence followed by a tobacco etch virus site. The resulting plasmids pETb0131 and pETVF1064 were transformed into E. coli BL21 (DE3) competent cells. For expression, an inoculum was started in LB medium plus 50  $\mu$ g of kanamycin per ml from an overnight culture. The cells were grown at 28 °C until reaching an  $A_{600}$  of 0.6. Then cells were induced by 1 mM isopropyl  $\beta$ -D-1-thiogalactopyranoside overnight at 18 °C. The cell lysate was extracted from the collected cells by BugBuster Master Mix (EMD Millipore) following the manufacturer's protocol. The lysate was incubated with HisPur nickel-nitrilotriacetic acid resin (Thermo Fisher Scientific) for 1 h at 4 °C and passed through a Pierce Centrifuge Column (Thermo Fisher Scientific). The column was washed in 50 mM NaH<sub>2</sub>PO<sub>4</sub>, 300 mM NaCl, and 20 mM imidazole (pH 8), and the VF\_0892 protein was eluted in 50 mM NaH<sub>2</sub>PO<sub>4</sub>, 300 mM NaCl, and 250 mM imidazole (pH 8). The eluted protein was dialyzed against 100 mM Tris-HCl (pH 7.5) and concentrated with an Amicon Ultra Centrifugal Filter Unit (EMD Millipore). The final products were analyzed with SDS-polyacrylamide gels, and their concentrations were determined with a bicinchoninic acid kit (Sigma). The eluted protein was dialyzed in 20 mM Tris-HCl to reduce the amount of solutes that went through the GC-MS column. E. coli X90(DE3) containing the empty pET28b(+) vector was subjected to the same expression and purification procedures, and the product was used as a control in detecting V. fischeri PanP activity using GC-MS.

#### Detection of $\beta$ -alanine from in vitro enzyme assays

The V. fischeri PanP activity was detected by measuring the formation of  $\beta$ -alanine in five different conditions, each with a 200-µl reaction volume. All reaction mixtures contained 20 mM Tris-HCl, 5 mM MgSO<sub>4</sub>, and 750  $\mu$ M pyridoxal 5'-phosphate (pH 7.5). In addition to the buffer components, the first condition also contained 36  $\mu$ g of purified V. fischeri PanP and 50 nmol of aspartate as the substrate. The second condition contained 36 µg of purified V. fischeri PanP but no substrate. The third condition contained 50 nmol of aspartate but no protein. The fourth condition contained 36 µg of purified V. fischeri PanP that had been heat-inactivated at 90 °C for 30 min and 50 nmol of aspartate. The last condition contained 20  $\mu$ g of protein obtained from the empty vector lysate and 50 nmol of aspartate. The reaction mixtures were incubated at 37 °C for 15 h and then stopped by heat inactivation at 90 °C for 30 min. The second and the fourth conditions were tested in biological



duplicates, and the other conditions were tested in biological triplicates. The heat-inactivated reaction mixtures were spun down at 15,000 rpm for 3 min, and their supernatants were taken for quantitation. A uniformly labeled,  $\beta$ -[U-<sup>13</sup>C]alanine internal standard (Cambridge Isotope Laboratories) was used for quantification via an isotope-ratio method using GC-MS (55). Prior to sample quantification, a suitable  $\beta$ -alanine fragment formula was identified. This process includes the following: (i) analyzing the mass spectrum of an unlabeled  $\beta$ -alanine sample to propose a feasible structure for the molecular ion of interest; (ii) comparing the theoretical and measured isotopic distributions of said structure; and (iii) verifying that the number of carbon backbone atoms present on the derivatized structure matches the base peak mass shift predicted to be seen in the  $\beta$ -[U-<sup>13</sup>C]alanine mass spectrum relative to the unlabeled spectrum (56). Once a fragment for quantification was identified, the purity (*i.e.* extent of labeling) of labeled  $\beta$ -alanine was measured and subsequently used to correct for the unlabeled portion of the labeled standard in downstream calculations. Following this step, aliquots of labeled internal standard were quantified using a known amount of unlabeled standard and calculating the ratio of <sup>12</sup>C/<sup>13</sup>C after correcting both for natural abundances of other isotopes present in the derivatized fragment, and for the unlabeled portion of the labeled standard, using the freely available software, IsoCor (57). Once characterized, known amounts of labeled standard were mixed with the supernatant of the enzymatic assay and dried at 90 °C. This step was followed by derivatization in a volumetric 1:1 ratio of pyridine with N-tert-butyl-dimethylsilyl-N-methyltrifluoroacetamide plus 1% tert-butyl-dimethylchlorosilane at 90 °C for 30 min to confer thermal stability and increased volatility amenable for analysis on the GC-MS instrument. Derivatized samples were centrifuged at 15,000 rpm for 3 min to sediment insoluble material, producing a cleaner supernatant for injection onto the GC-MS. Samples were run on a single quadrupole GC-MS QP2010S (Shimadzu) in electron ionization mode with an Rtx of 5 ms (Restek) low-bleed, fused-silica column for separation with helium as a carrier gas operating under a linear velocity control mode with a split ratio of 0.50, and a column flow of 1.50 ml/min. The temperature program for separation of  $\beta$ -alanine began with holding the column oven temperature at 35 °C for 10 min, ramping up at 25 °C/min to 300 °C, and holding for 19.4 min. Operational parameters included an injection temperature of 240 °C, ion source temperature of 260 °C, interface temperature of 240 °C, and a mass scan range of 100-450 m/z. To test the detection limit of our  $\beta$ -alanine quantification method, the method was used to measure a known amount of unlabeled  $\beta$ -alanine. Each sample (n = 3) contained 0.125, 0.25, 0.5, 1, or 2 nmol of unlabeled  $\beta$ -alanine. The method was able to detect the presence of unlabeled  $\beta$ -alanine in all these samples. Therefore, the detection limit of the method is below 0.125 nmol.

#### DC-PEPC-MDH-linked assays

Decarboxylase (DC), phosphoenolpyruvate carboxylase (PEPC), and malate dehydrogenase (MDH)-linked assays were performed by mixing 80  $\mu$ l of freshly prepared mixture A and 120  $\mu$ l of mixture B. Mixture A contained 100 mM Tris-HCl, 10 mM MgSO<sub>4</sub>. 1 mM pyridoxal 5'-phosphate (PLP), and various

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concentrations of aspartate and glutamate (pH 8.05). Mixture B contained purified decarboxylase and Infinity Carbon Dioxide Liquid Stable Reagent (Infinity, Thermo Fisher Scientific). The final decarboxylase concentrations used were 54  $\mu$ M PanD, 35 μM VF\_1064 enzyme, 28 μM V. fischeri PanP for assays at 37 °C, and 14 µM V. fischeri PanP for assays at 28 °C. Like similar DC-PEPC-MDH-linked assays (58-62), our assays were carried out in air. The interference of exogenous CO<sub>2</sub> from air and buffer solution was accounted for using a negative control, in which no substrate was added. The signal produced by the negative control was linear during the measurement period and was subtracted from all signals produced by other samples containing substrates. Values of  $K_m$  and  $k_{cat}$  were determined from nonlinear fitting into the Michaelis-Menten equation using Kaleida-Graph (Synergy Software). Averages across the three technical replicates were used as data points, whereas standard deviations for each data point were used as weights during the curve fitting. The  $K_m$  and  $k_{cat}$  values are reported with standard errors.

#### qPCR analysis

Wild-type *V. fischeri* cells were harvested at an  $A_{600}$  of  $\sim 0.6$ in DMM supplemented with glucose or mannitol as sole carbon source. Total RNA from the cell pellets was harvested using the Quick-RNA MicroPrep Kit (Zymo Research) with a 15-min oncolumn DNase treatment. RNA concentration and quality were assessed on a NanoDrop (Thermo Fisher Scientific) spectrophotometer. Reverse transcription for synthesizing cDNA and real-time qPCR were performed using the GoTaq Two-step RT-qPCR System (Promega) and an AriaMx real-time PCR machine (Agilent). The differential expression of VF\_A0062 (forward primer, TGGATATTCCGGGTGGTAAA, and reverse primer, ACGGGTCTTGTTCTGCAAGT) in the mannitol minimal medium and the glucose minimal medium was normalized to the control gene (V. fischeri polA, VF\_0074, forward primer, CGACAGCAGCAGAAGTGAAG, and reverse primer, AGCAAGACCAAACGCACTC) using the GED formula (63).

#### Growth inhibition test with leucine

An overnight LB culture of each *E. coli* strain was washed twice in minimal medium and subcultured by 1:100 dilution into fresh MOPS minimal medium with 20 mM glucose. Once the subculture grew to about mid-exponential phase, it was washed twice again and subcultured into fresh minimal medium with or without 4 mM leucine, and its  $A_{600}$  was measured on a 96-well plate by an Infinite M200 plate reader (Tecan).

#### Squid colonization competitions

Freshly hatched juvenile squid were collected from the rearing facility at the University of Hawaii and placed in filter-sterilized seawater. Squid were exposed to an  $\sim$ 1:1 mixed population of two strains consisting of *V. fischeri* ES114 carrying a chromosomally inserted erythromycin-GFP marker (64) and the indicated mutant strain, at a total of 3000 –5000 CFU/ml. Squid were incubated with bacteria for 3 h, then transferred to individual vials of *V. fischeri*-free seawater for an additional

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18–21 h. Colonized squid were subsequently anesthetized on ice and placed at -80 °C for surface sterilization. Individual squid were then homogenized and plated on LBS and LBS + erythromycin agar plates as described previously (65), and the ratio of strains present in the light organ was determined by counting the unmarked and erythromycin marked colonies. The relative competitive index (RCI) of the co-colonizing strains was calculated as follows: RCI = log(CFU mutant/CFU wild type)/(inoculum CFU mutant/inoculum CFU wild type).

*Author contributions*—S. P., E. G. R., and J. L. R. conceived and designed the experiments. S. P., K. N., P. A. A., and M. P. performed the experiments. S. P., K. N., and P. A. A. performed statistical analysis. S. P., K. N., P. A. A., and M. P. analyzed the data. S. P., K. N., P. A. A., M. P., J. L. R., and E. G. R. wrote the paper. All authors read and approved the final manuscript.

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Model-enabled gene search (MEGS) allows fast and direct discovery of enzymatic and transport gene functions in the marine bacterium *Vibrio fischeri* 

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Running title: MEGS allows discovery of metabolic gene functions

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Supplementary Figure S1. Auxotrophic growth of  $\Delta VF_0892$  for pantothenate and  $\beta$ -alanine. Each solid line represents OD<sub>600</sub> over time, and the associated colored transparent shade indicates the range of standard deviation (n = 3).  $\Delta VF_0892$  did not grow in 20 mM glucose minimal medium (green line), but grew in 20 mM glucose minimal medium with 10 mM calcium pantothenate (yellow line) or 10 mM  $\beta$ -alanine (gray line). Glc: glucose.



Supplementary Figure S2. Increased leucine sensitivity by *E. coli* expressing VF\_1172. Each solid line represents  $OD_{600}$  over time, and the associated colored transparent shade indicates the range of standard deviation (n = 3). The blue, yellow and cyan lines indicate that wild-type *E. coli* and wild-type *E. coli* and wild-type *I*. *coli* with a plasmid expressing VF\_0924 or VF\_1172 achieved a similar growth phenotype in minimal medium with 20 mM glucose. Addition of 4 mM leucine to the medium caused a slower growth of wild-type *E. coli* and wild-type *E. coli* with a plasmid expressing VF\_0924 (green and gray lines), and no growth of wild-type *E. coli* with a plasmid expressing VF\_1172 (black line). Glc: glucose.



Supplementary Figure S3. SDS-Page gel of purified proteins.

All gel pictures were taken by a Nikon D3200 camera. (a) SDS-PAGE gel of purified VF\_0892 protein and proteins from the empty vector control. These purification products were used in the detection of  $\beta$ -alanine using GC-MS. (Adobe Lightroom auto-adjust: exposure + 0.65, contrast + 100, whites + 69, blacks -73) (b) SDS-PAGE gel of purified b0131 protein, (Adobe Lightroom auto-adjust: exposure + 0.05, contrast + 25, whites + 53, blacks -49), VF\_0892 protein, and VF\_1064 protein (Adobe Lightroom auto-adjust: exposure + 0.30, contrast -22, whites + 73, blacks -56). These purification products were used in the DC-PEPC-MDH-linked assays.



Supplementary Figure S4. Substrate specificity of the VF\_1064 enzyme. Average reaction rates ( $\Delta$ AU/min) are shown for three technical replicates of the DC-PEPC-MDH-linked assays performed at the specified aspartate or glutamate concentration with standard deviation shown as the error bars. (a) Reaction rates of the VF\_1064 enzyme with a concentration of 10 mM of either glutamate or aspartate at 37°C. (b) Reactions rates of the VF\_1064 enzyme with various concentrations of glutamate at 37°C.



Supplementary Figure S5. A plasmid expressing VF\_1064 failed to support growth of the *E. coli*  $\Delta panD$  mutant. Each solid line represents OD<sub>600</sub> over time, and the associated colored transparent shade indicates the range of standard deviation (n = 3).  $\Delta panD$  with an empty vector (green line) or a plasmid expressing VF\_1064 (gray line) did not grow in 20 mM glucose minimal medium. Wild-type *E. coli* (blue line) and  $\Delta panD$  with a plasmid expressing VF\_0892 (yellow line) grew in 20 mM glucose minimal medium. Glc: glucose.



Supplementary Figure S6. L-sorbose failed to support growth of wild-type V. fischeri as a sole carbon source. Growth of wild-type V. fischeri on sole carbon sources was tested in 17 by 100 mm test tubes (n = 3, SD plotted as error bars). An overnight culture of wild-type V. fischeri in LBS medium was subcultured by 1:100 dilution into fresh minimal medium with a sole carbon source (20 mM of the indicated sugar) or without a carbon source.  $OD_{600}$  was measured by a spectrophotometer (Biomate 3) at 0, 15.5, and 24 hours post inoculation. Wild-type V. fischeri was unable to grow in minimal medium with L-sorbose as the sole source of carbon.



Supplementary Figure. S7. Squid light-organ colonization phenotypes of the MEGS-discovered V. *fischeri* genes. V. *fischeri* knockout mutants ( $\Delta VF_A0062$ ,  $\Delta VF_0668$ , and  $\Delta VF_0924\Delta VF_1172$ ) were tested for their efficiency colonizing juvenile E. scolopes in competition with wild-type strain ES114 (WT) carrying a chromosomally-inserted erythromycin-GFP marker (1). Results of three independent trials, each consisting of n >= 10 co-colonized squid, were plotted as the mean competitive index +/- SE.

Supplementary Table S1. Essential genes in LBS medium predicted by insertion sequencing study (2) and comparisons with model predictions.

Essential (Insertion Sequencing Study): Essential (Model Prediction)

VF 0015, VF 0016, VF 0028, VF 0046, VF 0053, VF 0065, VF 0066, VF 0106, VF 0125, VF 0132,	
VF 0138, VF 0139, VF 0277, VF 0284, VF 0302, VF 0388, VF 0389, VF 0390, VF 0401, VF 0411,	
VF 0414, VF 0415, VF 0439, VF 0453, VF 0465, VF 0466, VF 0467, VF 0470, VF 0471, VF 0481,	
VF 0536, VF 0576, VF 0617, VF 0618, VF 0619, VF 0629, VF 0630, VF 0682, VF 0687, VF 0705,	
VF 0711, VF 0712, VF 0742, VF 0743, VF 0753, VF 0764, VF 0765, VF 0767, VF 0793, VF 0794,	
VF 0809, VF 0812, VF 0839, VF 0888, VF 0892, VF 0908, VF 0949, VF 0965, VF 1159, VF 1214.	
VF 1235 VF 1236 VF 1292 VF 1600 VF 1625 VF 1695 VF 1700 VF 1727 VF 1735 VF 1739	
VF 1740 VF 1741 VF 1754 VF 1887 VF 1914 VF 1918 VF 1946 VF 1956 VF 1957 VF 1958	
VF 1960 VF 1997 VF 2072 VF 2073 VF 2094 VF 2128 VF 2135 VF 2170 VF 2184 VF 2189	
VF 2200 VF 2201 VF 2203 VF 2204 VF 2205 VF 2206 VF 2234 VF 2286 VF 2331 VF 2348	
VF 2372 VF 2385 VF 2386 VF 2387 VF 2402 VF 2424 VF 2426 VF 2428 VF 2433 VF 2544	
VF 2562 VF A0421 VF A0424 VF A0570 VF A0601 VF A0602	
Essential (Insertion Sequencing Study): Not Essential (Model Prediction)	
VE 0.067 VE 0.104 VE 0.202 VE 0.391 VE 0.392 VE 0.402 VE 0.442 VE 0.443 VE 0.460 VE 0.480	
VE 0706 VE 0748 VE 0823 VE 0824 VE 0001 VE 0013 VE 0043 VE 0053 VE 0054 VE 1201	
$VF_{0}^{-0}$ VF 1/40, $VF_{0}^{-0}$ VF 1/002, $VF_{0}^{-0}$ VF 1/000, $VF_{0$	
$VF_{1202}, VF_{1414}, VF_{1002}, VF_{1007}, VF_{1094}, VF_{1742}, VF_{1700}, VF_{1760}, VF_{1094}, VF_{1747}, VF_{1747}, VF_{1007}, VF_{1007}$	
$VF_{1950}, VF_{1951}, VF_{1952}, VF_{2075}, VF_{2070}, VF_{2085}, VF_{2084}, VF_{2105}, VF_{2108}, VF_{2178}, VF_{2178}$	
VF_2195, VF_2207, VF_2347, VF_2509, VF_A0425	
Not Essential (Insertion Sequencing Study). Not Essential (Model Prediction)	
VF_0014, VF_0017, VF_0023, VF_0024, VF_0025, VF_0027, VF_0031, VF_0032, VF_0035, VF_0034, VF_0035, VF_0037, VF_	
VF_0035, VF_0036, VF_0037, VF_0048, VF_0054, VF_0057, VF_0060, VF_0062, VF_0064, VF_0072,	
VF_0080, VF_0090, VF_0093, VF_0112, VF_0116, VF_0118, VF_0137, VF_0166, VF_0167, VF_0168,	
VF_0169, VF_0176, VF_0177, VF_0178, VF_0179, VF_0180, VF_0182, VF_0183, VF_0185, VF_0186,	
VF_0193, VF_0201, VF_0206, VF_0207, VF_0209, VF_0220, VF_0264, VF_0265, VF_0266, VF_0267,	
VF_0268, VF_0269, VF_0276, VF_0285, VF_0287, VF_0292, VF_0293, VF_0294, VF_0295, VF_0310,	
VF_0311, VF_0312, VF_0319, VF_0320, VF_0321, VF_0323, VF_0331, VF_0337, VF_0338, VF_0339,	
VF_0403, VF_0405, VF_0406, VF_0407, VF_0408, VF_0413, VF_0418, VF_0420, VF_0423, VF_0425,	
VF_0429, VF_0435, VF_0440, VF_0441, VF_0446, VF_0447, VF_0449, VF_0472, VF_0473, VF_0474,	
VF_0504, VF_0505, VF_0506, VF_0507, VF_0509, VF_0531, VF_0532, VF_0533, VF_0537, VF_0539,	
VF_0540, VF_0543, VF_0553, VF_0554, VF_0558, VF_0561, VF_0585, VF_0587, VF_0590, VF_0598,	
VF_0603, VF_0604, VF_0605, VF_0606, VF_0607, VF_0614, VF_0624, VF_0625, VF_0637, VF_0638,	
VF_0644, VF_0645, VF_0648, VF_0651, VF_0652, VF_0657, VF_0663, VF_0665, VF_0666, VF_0667,	
VF_0668, VF_0684, VF_0685, VF_0686, VF_0695, VF_0700, VF_0701, VF_0702, VF_0703, VF_0716,	
VF_0718, VF_0720, VF_0736, VF_0737, VF_0738, VF_0740, VF_0741, VF_0745, VF_0760, VF_0772,	
VF_0773, VF_0775, VF_0776, VF_0778, VF_0781, VF_0785, VF_0786, VF_0787, VF_0804, VF_0807,	
VF_0808, VF_0816, VF_0818, VF_0819, VF_0820, VF_0821, VF_0822, VF_0825, VF_0826, VF_0828,	
VF_0829, VF_0830, VF_0834, VF_0836, VF_0837, VF_0887, VF_0890, VF_0899, VF_0900, VF_0902,	
VF 0903, VF 0909, VF 0911, VF 0914, VF 0918, VF 0922, VF 0924, VF 0928, VF 0940, VF 0941,	
VF 0942, VF 0973, VF 0976, VF 1012, VF 1013, VF 1014, VF 1015, VF 1016, VF 1017, VF 1018,	
VF 1019, VF 1026, VF 1027, VF 1028, VF 1029, VF 1031, VF 1032, VF 1033, VF 1055, VF 1056,	
VF 1064, VF 1084, VF 1114, VF 1115, VF 1121, VF 1124, VF 1141, VF 1143, VF 1160, VF 1171,	
VF 1172, VF 1176, VF 1177, VF 1179, VF 1180, VF 1186, VF 1188, VF 1189, VF 1197, VF 1203,	
VF 1212, VF 1223, VF 1224, VF 1225, VF 1238, VF 1241, VF 1242, VF 1248, VF 1252, VF 1253.	
VF 1270, VF 1282, VF 1284, VF 1285, VF 1299, VF 1300, VF 1301, VF 1302, VF 1304, VF 1315.	
VF 1316, VF 1317, VF 1319, VF 1337, VF 1341, VF 1352, VF 1358, VF 1359, VF 1360, VF 1366.	
VF 1387. VF 1405. VF 1408. VF 1444. VF 1445. VF 1446. VF 1447. VF 1448. VF 1458. VF 1479.	

VF_1485, VF_1487, VF_1488, VF_1498, VF_1502, VF_1511, VF_1521, VF_1522, VF_1527, VF_1531,			
VF 1543, VF 1544, VF 1551, VF 1552, VF 1553, VF 1554, VF 1556, VF 1558, VF 1577, VF 1579,			
VF 1580, VF 1584, VF 1585, VF 1586, VF 1587, VF 1588, VF 1590, VF 1591, VF 1593, VF 1594,			
VF 1595, VF 1596, VF 1597, VF 1599, VF 1606, VF 1608, VF 1609, VF 1610, VF 1611, VF 1612,			
VF 1613, VF 1621, VF 1630, VF 1634, VF 1635, VF 1644, VF 1645, VF 1651, VF 1665, VF 1673,			
VF 1682, VF 1688, VF 1691, VF 1698, VF 1699, VF 1702, VF 1708, VF 1714, VF 1718, VF 1719,			
VF 1721, VF 1724, VF 1732, VF 1737, VF 1738, VF 1743, VF 1750, VF 1752, VF 1755, VF 1770,			
VF 1775, VF 1781, VF 1782, VF 1793, VF 1798, VF 1799, VF 1803, VF 1810, VF 1811, VF 1820,			
VF 1821, VF 1822, VF 1823, VF 1824, VF 1893, VF 1895, VF 1897, VF 1903, VF 1904, VF 1905,			
VF 1920, VF 1926, VF 1927, VF 1928, VF 1929, VF 1932, VF 1938, VF 1972, VF 1973, VF 1983,			
VF 1984, VF 1985, VF 1986, VF 2043, VF 2044, VF 2045, VF 2046, VF 2049, VF 2056, VF 2057,			
VF 2058, VF 2063, VF 2064, VF 2065, VF 2070, VF 2078, VF 2080, VF 2101, VF 2104, VF 2106,			
VF 2110, VF 2115, VF 2116, VF 2117, VF 2118, VF 2124, VF 2125, VF 2139, VF 2140, VF 2141,			
VF 2142, VF 2143, VF 2145, VF 2146, VF 2147, VF 2148, VF 2149, VF 2150, VF 2151, VF 2152,			
VF 2157, VF 2158, VF 2162, VF 2169, VF 2173, VF 2174, VF 2176, VF 2179, VF 2181, VF 2183,			
VF 2192, VF 2218, VF 2220, VF 2232, VF 2233, VF 2237, VF 2238, VF 2239, VF 2240, VF 2245,			
VF 2246. VF 2247. VF 2248. VF 2256. VF 2258. VF 2262. VF 2263. VF 2264. VF 2266. VF 2267.			
VF 2272, VF 2282, VF 2283, VF 2285, VF 2287, VF 2288, VF 2298, VF 2301, VF 2303, VF 2304,			
VF 2305, VF 2306, VF 2307, VF 2308, VF 2316, VF 2318, VF 2326, VF 2334, VF 2335, VF 2336,			
VF 2337, VF 2340, VF 2341, VF 2353, VF 2354, VF 2356, VF 2357, VF 2360, VF 2364, VF 2366,			
VF 2367, VF 2368, VF 2380, VF 2383, VF 2394, VF 2395, VF 2400, VF 2403, VF 2435, VF 2439,			
VF 2443, VF 2444, VF 2445, VF 2448, VF 2462, VF 2463, VF 2478, VF 2481, VF 2482, VF 2485,			
VF 2489, VF 2508, VF 2510, VF 2515, VF 2516, VF 2517, VF 2518, VF 2519, VF 2528, VF 2537,			
VF 2538, VF 2546, VF 2547, VF 2553, VF 2556, VF 2557, VF 2558, VF 2559, VF 2560, VF 2563,			
VF 2564, VF 2565, VF 2566, VF 2567, VF 2568, VF 2570, VF 2571, VF 2576, VF A0005.			
VF A0019, VF A0042, VF A0062, VF A0080, VF A0082, VF A0083, VF A0086, VF A0100,			
VF A0113, VF A0119, VF A0123, VF A0124, VF A0125, VF A0128, VF A0129, VF A0142,			
VF A0158, VF A0159, VF A0160, VF A0173, VF A0188, VF A0189, VF A0235, VF A0236,			
VF_A0239, VF_A0248, VF_A0249, VF_A0250, VF_A0251, VF_A0281, VF_A0282, VF_A0283,			
VF_A0290, VF_A0291, VF_A0292, VF_A0298, VF_A0299, VF_A0306, VF_A0316, VF_A0321,			
VF A0322, VF A0351, VF A0352, VF A0353, VF A0355, VF A0356, VF A0366, VF A0385.			
VF A0394, VF A0412, VF A0417, VF A0418, VF A0427, VF A0438, VF A0450, VF A0451,			
VF A0452, VF A0453, VF A0468, VF A0469, VF A0470, VF A0492, VF A0493, VF A0494,			
VF_A0497, VF_A0507, VF_A0529, VF_A0530, VF_A0558, VF_A0565, VF_A0585, VF_A0586,			
VF_A0628, VF_A0640, VF_A0685, VF_A0686, VF_A0695, VF_A0696, VF_A0700, VF_A0702,			
VF_A0703, VF_A0709, VF_A0710, VF_A0745, VF_A0746, VF_A0747, VF_A0748, VF_A0760,			
VF A0784, VF A0786, VF A0789, VF A0794, VF A0797, VF A0798, VF A0799, VF A0800.			
VF_A0801, VF_A0803, VF_A0808, VF_A0809, VF_A0810, VF_A0813, VF_A0829, VF_A0830,			
VF A0832, VF A0839, VF A0840, VF A0847, VF A0917, VF A0918, VF A0919, VF A0920.			
VF A0921 VF A0922 VF A0923 VF A0940 VF A0941 VF A0942 VF A0958 VF A0966			
VF A0969, VF A0987, VF A0988, VF A0989, VF A0999, VF A1000, VF A1001, VF A1002.			
VF A1003 VF A1004 VF A1005 VF A1008 VF A1010 VF A1044 VF A1100 VF A1123			
VF A1146 VF A1161 VF A1189 VF 0098 (only after adding VF 0924 and VF 1172)			
Not Essential (Insertion Sequencing Study): Essential (Model Prediction)			
VF 0152. VF 0212. VF 0304. VF 0342. VF 0393. VF 0545. VF 0957. VF 1666. VF 1667. VF 1669			
VF 1670. VF 1671. VF 1672. VF 1761. VF 1780. VF 1805. VF 1931. VF 2284. VF 2291. VF 2292			
VF 2309. VF 2484. VF 2486. VF 2535. VF A0805 VF A0806			

Draft model and experiment discrepancies			E. coli genes		
Category	Model prediction	Experimental data	(bnums) missing V. <i>fischeri</i> ortholog	Recipient strain	Selective medium
	No growth in minimal medium	Growth in minimal medium	<i>panD</i> (b0131)	ΔpanD	MOPS minimal medium + 20 mM glucose
Growth phenotype	Mannitol is not a sole carbon source	Mannitol is a sole carbon source	<i>mtlD</i> (b3600)	$\Delta mtlD$	MOPS minimal medium + 20 mM mannitol
	N-acetyl- neuraminate is not a sole carbon source	N-acetyl- neuraminate is a sole carbon source	<i>nanT</i> (b3224)	∆nanT	MOPS minimal medium + 20 mM N- acetylneuraminate
Gene essentiality	Glutamine synthase (VF_0098) is essential in LBS medium	Glutamine synthase (VF_0098) is non-essential in LBS medium	glnH (b0811) glnP (b0810) glnQ (b0809)	∆glnP	MOPS minimal medium + 20 mM glutamine + vitamin supplement (0.05 mM thiamine, 0.05 mM niacinamide, and 20 nM biotin)

<b>Supplementary</b>	Table	S2. R	lecipient	strain and	selective	medium	design.
11 2							

Aliivibrio logei	Pseudoalteromonas flavipulchra	Vibrio coralliilvticus
Aliivibrio salmonicida	Pseudoalteromonas halonlanktis	Vibrio crassostreae
Aliivibrio wodanis	Pseudoalteromonas issachenkonii	Vibrio cvclitrophicus
Alishewanella aestuarii	Pseudoalteromonas lipolvtica	Vibrio diabolicus
Alishewanella agri	Pseudoalteromonas luteoviolacea	Vibrio diazotrophicus
Alishewanella ieotgali	Pseudoalteromonas marina	Vibrio ezurae
Arsukibacterium ikkense	Pseudoalteromonas phenolica	Vibrio fischeri
Colwellia niezonhila	Pseudoalteromonas piscicida	Vibrio fluvialis
Colwellia psychrerythraea	Pseudoalteromonas porphyrae	Vibrio fortis
Enterovibrio calviensis	Pseudoalteromonas rubra	Vibrio furnissii
Enterovibrio norvegicus	Pseudoalteromonas ruthenica	Vibrio genomosp.
Grimontia hollisae	Pseudoalteromonas spongiae	Vibrio halioticoli
Grimontia indica	Pseudoalteromonas tetraodonis	Vibrio harvevi
Idiomarina abvssalis	Pseudoalteromonas translucida	Vibrio hepatarius
Idiomarina loihiensis	Pseudoalteromonas tunicata	Vibrio hvugaensis
Idiomarina salinarum	Pseudoalteromonas undina	Vibrio ichthvoenteri
Idiomarina woesei	Rheinheimera nanhaiensis	Vibrio kanaloae
Idiomarina xiamenensis	Rheinheimera nerlucida	Vibrio lentus
Idiomarina zobellii	Rheinheimera texasensis	Vibrio litoralis
Marinobacter adhaerens	Salinivibrio costicola	Vibrio maritimus
Marinobacter algicola	Shewanella algae	Vibrio metoecus
Marinohacter daenoensis	Shewanella baltica	Vibrio metschnikovii
Marinohacter excellens	Shewanella benthica	Vibrio mimicus
Marinobacter	Shewanella colwelliana	Vibrio mvtili
Marinobacter lipolvticus	Shewanella decolorationis	Vibrio natriegens
Marinobacter manganoxvdans	Shewanella denitrificans	Vibrio navarrensis
Marinobacter nanhaiticus	Shewanella fidelis	Vibrio nentunius
Marinobacter psychrophilus	Shewanella frigidimarina	Vibrio nereis
Marinobacter santoriniensis	Shewanella haliotis	Vibrio nigripulchritudo
Marinobacter subterrani	Shewanella loihica	Vibrio ordalii
Photobacterium angustum	Shewanella oneidensis	Vibrio orientalis
Photobacterium aphoticum	Shewanella nealeana	Vibrio owensii
Photobacterium aauae	Shewanella niezotolerans	Vibrio nacinii
Photobacterium damselae	Shewanella putrefaciens	Vibrio parahaemolvticus
Photobacterium gaetbulicola	Shewanella sediminis	Vibrio ponticus
Photobacterium galatheae	Shewanella violacea	Vibrio proteolvticus
Photobacterium ganghwense	Shewanella woodvi	Vibrio rotiferianus
Photobacterium halotolerans	Thalassomonas actiniarum	Vibrio rumoiensis
Photobacterium iliopiscarium	Thalassomonas viridans	Vibrio sagamiensis
Photobacterium kishitanii	Vibrio albensis	Vibrio scophthalmi
Photobacterium leiognathi	Vibrio alginolvticus	Vibrio shilonii
Photobacterium marinum	Vibrio anguillarum	Vibrio sinaloensis
Photobacterium phosphoreum	Vibrio antiauarius	Vibrio splendidus
Photobacterium profundum	Vibrio azureus	Vibrio tasmaniensis
Photobacterium swingsii	Vibrio bivalvicida	Vibrio toranzoniae
Pseudoalteromonas agarivorans	Vibrio brasiliensis	Vibrio tubiashii
Pseudoalteromonas arctica	Vibrio breoganii	Vibrio variabilis
Pseudoalteromonas atlantica	Vibrio camphellii	Vibrio vulnificus
Pseudoalteromonas citrea	Vibrio caribbeanicus	Vibrio xuii
Pseudoalteromonas distincta	Vibrio cholera	
Pseudoalteromonas elvakovii	Vibrio cholerae	

# Supplementary Table S3. List of all species that contain a NOD\_panD\_pyr domain protein.

Reactions for simulating V. fischeri defined minimal medium				
<b>Reaction Abbreviation</b>	Reaction Name			
EX_k(e)	K <sup>+</sup> exchange			
EX_ca2(e)	Calcium exchange			
EX_cbl1(e)	Cob(I)alamin exchange			
EX_cl(e)	Chloride exchange			
EX_co2(e)	CO <sub>2</sub> exchange			
EX_cobalt2(e)	Co <sup>2+</sup> exchange			
EX_cu2(e)	Cu <sup>2+</sup> exchange			
EX_fe2(e)	Fe <sup>2+</sup> exchange			
EX_fe3(e)	Fe <sup>3+</sup> exchange			
EX_h(e)	$H^+$ exchange			
EX_h2o(e)	H <sub>2</sub> O exchange			
EX_mg2(e)	Mg exchange			
EX_mn2(e)	Mn <sup>2+</sup> exchange			
EX_mobd(e)	Molybdate exchange			
EX_na1(e)	Sodium exchange			
EX_nh4(e)	Ammonia exchange			
EX_ni2(e)	Ni <sup>2+</sup> exchange			
EX_o2(e)	O <sub>2</sub> exchange			
EX_pi(e)	Phosphate exchange			
EX_sel(e)	Selenate exchange			
EX_slnt(e)	Selenite exchange			
EX_so4(e)	Sulfate exchange			
EX_tungs(e)	tungstate exchange			
EX_zn2(e)	Zinc exchange			
Additional exchange reactions for simulating LBS medium				
EX_adn(e)	Adenosine exchange			
EX_ala-L(e)	L-Alanine exchange			
EX_amp(e)	AMP exchange			
EX_arg-L(e)	L-Arginine exchange			
EX_asn-L(e)	L-Asparagine exchange			
EX_aso3(e)	Arsenite exchange			
EX_asp-L(e)	L-Aspartate exchange			
Ex_btn(e)	Biotin exchange			
EX_cd2(e)	Cadmium exchange			
EX_cmp(e)	CMP exchange			
EX_cys-L(e)	L-Cysteine exchange			
EX_dad-2(e)	Deoxyadenosine exchange			
EX_dcyt(e)	Deoxycytidine exchange			
EX_fol(e)	Folate exchange			
EX gln-L(e)	L-Glutamine exchange			

Supplementary Table S4. Exchange reactions with negative lower limits.

EX_glu-L(e)	L-Glutamate exchange
EX_gly(e)	Glycine exchange
EX_gmp(e)	GMP exchange
EX_gsn(e)	Guanosine exchange
EX_h2s(e)	Hydrogen sulfide exchange
EX_hg2(e)	Hg <sup>2+</sup> exchange
EX_his-L(e)	L-Histidine exchange
EX_hxan(e)	Hypoxanthine exchange
EX_ile-L(e)	L-Isoleucine exchange
EX_ins(e)	Inosine exchange
EX_leu-L(e)	L-Leucine exchange
EX_lipoate(e)	Lipoate exchange
EX_lys-L(e)	L-Lysine exchange
EX_met-L(e)	L-Methionine exchange
EX_nac(e)	Nicotinate exchange
EX_phe-L(e)	L-Phenylalanine exchange
EX_pheme(e)	Protoheme exchange
EX_pnto-R(e)	(R)-Pantothenate exchange
EX_pro-L(e)	L-Proline exchange
EX_pydx(e)	Pyridoxal exchange
EX_ribflv(e)	Riboflavin exchange
EX_ser-L(e)	L-Serine exchange
EX_skm(e)	Shikimate exchange
EX_thm(e)	Thiamin exchange
EX_thr-L(e)	L-Threonine exchange
EX_thymd(e)	Thymidine exchange
EX_trp-L(e)	L-Tryptophan exchange
EX_tyr-L(e)	L-Tyrosine exchange
EX_ump(e)	UMP exchange
EX_ura(e)	Uracil exchange
EX_uri(e)	Uridine exchange
EX_val-L(e)	L-Valine exchange

Strain or plasmid	Description	Source	
V. fischeri Strains			
ES114	Wild-type E. scolopes light-organ isolate	(3)	
ES114 GFP-erm Tn7	ES114 carrying a chromosomally inserted erythromycin-GFP	(1)	
	marker	(1)	
ΔVF_0892	ES114 ΔVF_0892	This work	
$\Delta VF_A062$	ES114 ΔVF_A0062	This work	
ΔVF_0668	ES114 ΔVF_0668	This work	
ΔVF_0924	ES114 ΔVF_0924	This work	
ΔVF_1172	ES114 ΔVF_1172	This work	
ΔVF_0924 ΔVF_1172	ES114 ΔVF_0924 ΔVF_1172	This work	
E. coli Strains			
		Coli Genetic	
BW25113	<i>E. coli</i> K-12 BW25113	Stock Center	
		(strain 7636)	
panD::kan	BW25113 panD::kan	(4)	
$\Delta panD$	Derived from <i>panD</i> ::kan by removing kan using pCP20.	This work	
<i>mtlD</i> :: kan	BW25113 <i>mtlD</i> :: kan	(4)	
$\Delta m t l D$	Derived from <i>mtlD</i> ::kan by removing kan using pCP20.	This work	
<i>nanT</i> :: kan	BW25113 <i>nanT</i> :: kan	(4)	
$\Delta nanT$	Derived from <i>nanT</i> ::kan by removing kan using pCP20.	This work	
<i>glnP</i> :: kan	BW25113 <i>glnP</i> :: kan	(4)	
$\Delta glnP$	Derived from <i>glnP</i> ::kan by removing kan using pCP20.	This work	
DH5a dnir	$F^{-} \varphi 80 lac Z \Delta M15 \Delta (lac ZYF arg F) U169 sup E44 deoR hsd R17$	(5)	
DIISu Apri	<i>recA1 endA1 gyrA96 thi-1 relA1</i> , lysogenized with $\lambda pir$		
B3914	$F^{-}$ RP4-2-Tc::Mu $\Delta dapA$ ::( <i>erm-pir</i> )	(6)	
P3714	<i>gyrA462 zei-298</i> ::Tn10 (Kan <sup>r</sup> Erm <sup>r</sup> Tec <sup>r</sup> )		
X90(DE3)	Expression strain	(7)	
Plasmids			
nCP20	pSC101 based vector expressing the yeast Flp recombinase,	(8)	
pCr20	Amp <sup>r</sup> , Cam <sup>r</sup>	(0)	

Supplementary Table S5. Strains and plasmids used in this work.

pZE21MCS	Vector for <i>E. coli</i> complementation. Kan <sup>r</sup> , colE1 ori	EXPRESSYS
pZEVF0892	pZE21MCS:: VF_0892	This work
pZEVF1064	pZE21MCS:: VF_1064	This work
pZEVFA0062	pZE21MCS:: VF_A0062	This work
pZEVF0668	pZE21MCS:: VF_0668	This work
pZEVF0924	pZE21MCS:: VF_0924	This work
pZEVF1172	pZE21MCS:: VF_1172	This work
pEVS104	Conjugative helper plasmid. Kan <sup>r</sup>	(9)
pKV363	Mobilizable suicide vector for <i>V. fischeri</i> chromosomal deletion. Cam <sup>r</sup>	(10)
pKV363VF0892	pKV363:: ΔVF_0892	This work
pKV363VFA0062	pKV363:: ΔVF_A0062	This work
pKV363VF0668	pKV363:: ΔVF_0668	This work
pKV363VF0924	pKV363:: ΔVF_0924	This work
pKV363VF1172	pKV363:: ΔVF_1172	This work
pKV363VF0924VF1172	pKV363:: ΔVF_0924 ΔVF_1172	This work
pVSV105	pES213-based vector for V. fischeri complementation. Cam <sup>r</sup>	(11)
pVF0892	pVSV105:: VF_0892	This work
pVFA0062	pVSV105:: VF_A0062	This work
pVF0668	pVSV105:: VF_0668	This work
pVF0924	pVSV105:: VF_0924	This work
pVF1172	pVSV105:: VF_1172	This work
pET28	Expression vector carrying an N-terminal and a C-terminal His-tag sequence	Novagen
pETVF0892	pET28:: VF_0892 with a C-terminal His-tag sequence	This work
pETVF1064	pET28:: VF_1064 with an N-terminal His-tag sequence followed by a TEV site	This work
pETb0131	pET28:: b0131 with an N-terminal His-tag sequence followed by a TEV site	This work

# Supplementary Table S6. V. fischeri Defined Minimal Medium (DMM) recipe

Chemical or Stock solution	Amount (g or mL)	
1 M Na <sub>2</sub> HPO <sub>4</sub>	0.287	
1 M NaH <sub>2</sub> PO <sub>4</sub>	0.0527	
MgSO <sub>4</sub> -7H <sub>2</sub> O	12.32	
CaCl <sub>2</sub> -2H <sub>2</sub> O	1.47	
NaCl	17.52	
KCl	0.75	
Sistroms trace elements	0.1	
Sistroms vitamins	0.1	
5.8% K <sub>2</sub> HPO <sub>4</sub>	1	
NH <sub>4</sub> Cl	0.59	
MOPS	8.372	
Tricine	0.717	
PIPES disodium salt	17.3	
(to substitute MOPS/Tricine)	17.5	
Carbon source	(as indicated)	

(1 L, buffered at pH 7.5 with either MOPS/Tricine or PIPES disodium salt)

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