Real-time environmental monitoring of contaminants using living electronic sensors

Joshua T. Atkinson^{1,2,§,†}, Lin Su^{2,3,4,§,‡}, Xu Zhang², George N. Bennett^{2,5}, Jonathan J. Silberg^{2,5,6,*}, and Caroline M. Ajo-Franklin^{2,4,7,*}

Affiliations:

¹Systems, Synthetic, and Physical Biology Graduate Program, Rice University, 6100 Main MS-180, Houston, Texas 77005, United States of America.

²Department of BioSciences, Rice University, MS-140, 6100 Main Street, Houston, TX, 77005, United States of America.

³State Key Laboratory of Bioelectronics, Southeast University, Nanjing 210018, People's Republic of China.

⁴Molecular Foundry, Lawrence Berkeley National Laboratory, Berkeley, CA, 94720, United States of America.

⁵Department of Chemical and Biomolecular Engineering, Rice University, MS-362, 6100 Main Street, Houston, TX, 77005, United States of America.

⁶Department of Bioengineering, Rice University, MS-142, 6100 Main Street, Houston, TX, 77005, United States of America.

⁷Molecular Biophysics and Integrated Bioimaging Division, Lawrence Berkeley National Laboratory, Berkeley, CA, 94720, United States of America.

*Corresponding authors. Emails: cajo-franklin@rice.edu; joff@rice.edu.

§These authors contributed equally, names listed in alphabetical order.

† Present Address: Department of Physics and Astronomy, University of Southern California, Los Angeles, CA 90089

‡ Present Address: Department of Chemistry, University of Cambridge, Cambridge CB2 1EW, United Kingdom

ABSTRACT

Real-time chemical sensing is needed to counter the global threats posed by pollution. We combine synthetic biology and materials engineering to develop a living bioelectronic sensor platform with minute detection times. *Escherichia coli* was programmed to reduce an electrode in a chemical-dependent manner using a modular, eight-component, synthetic electron transport chain. This strain produced significantly more current upon exposure to thiosulfate, an anion that causes microbial blooms. Incorporating a protein switch into the synthetic pathway and encapsulation of microbes with electrodes and conductive nanomaterials yielded a living bioelectronic sensor that could detect an endocrine disruptor within two minutes in riverine water, implicating the signal as mass transfer limited. These findings provide a new platform for miniature, low-power sensors that safeguard ecological and human health.

One Sentence Summary: Chemicals are detected electrically using an allosterically-regulated electron transfer pathway in designer microbes.

MAIN TEXT

Contamination of freshwater with natural and synthetic chemicals is a global environmental challenge (1). Of particular concern are chemicals that affect vertebrate reproduction and inorganic compounds that stimulate microbial blooms, as both can have severe ecological impacts when they enter the environment (2–4). Because chemical releases can be dynamic and transient, there is a need to sense these chemicals *in situ*, in real time (4). This sensing must also be accurate across environments with varying abiotic conditions.

Recent strides in biosensing enable the detection of contaminants via different modalities. Synthetic biology has yielded field-deployable biosensors that monitor chemical contaminants (5), reporting them as visual signals (6, 7). Alternatively, bioelectronic sensors have been developed using bacteria that couple chemical sensing to the production of electrical current through a process called extracellular electron transfer (EET) (8–12). These sensors all rely on regulating transcription for detection, limiting their response times to ≥ 30 minutes.

Engineered microorganisms have been integrated into materials to create free-standing devices for sensing diverse chemicals (13). These approaches, which typically encapsulate bacteria in hydrogels, have yielded deployable optical sensors for explosives (14), heavy metals (15), and chemical inducers (16, 17). While providing mechanical integrity and supporting continuous sensing, these materials attenuate transmission of the signals, degrading the signal-to-noise ratio and temporal response.

Thus, to enable real-time environmental biosensing of chemicals, we need new strategies to rapidly control and robustly transmit electrical current from microbes to electronics. Here, we combine synthetic biology and materials engineering to overcome

these challenges in parallel by programming a microbe to report in real time on contaminants that trigger rapid microbial growth and impair vertebrate reproduction, interfacing these cells with electrodes using synthetic materials to enhance the signal-to-noise of conditional EET, and showing that this bioelectronic sensor platform can sense different chemicals in urban waterway samples.

To develop a strategy to rapidly report on inorganic nutrients that trigger microbial blooms by producing current, we designed a synthetic electron transfer (ET) pathway in *Escherichia coli* where sulfur oxyanions gate electron flow to an electrode. We chose to test this strategy using thiosulfate, a common dechlorination agent used in water treatment that can trigger microbial blooms that impact aquatic habitats when used in excess (2). We designed a thiosulfate-dependent ET pathway using three modules (Fig. 1A). The Input (I) module couples NADPH oxidation to the reduction of sulfite, a product of sulfur assimilation when cells are exposed to thiosulfate, through the expression of ferredoxin-NADP reductase (FNR), ferredoxin (Fd), and sulfite reductase (SIR). The Coupling (C) module uses the product of the Input module, sulfide, and a sulfide-quinone reductase (SQR) to reduce inner-membrane quinones to quinols. Lastly, the Output (O) module, composed of the quinol dehydrogenase CymA and the cytochrome *c*-porin complex MtrCAB (CymA-MtrCAB), rapidly transfers electrons from quinols to an electrode (18, 19). These modules route electrons from NADPH to an electrode using an ET pathway that requires twenty-nine cofactors, including twenty-four hemes, two flavins, one siroheme, one 4Fe4S, and one 2Fe2S.

To evaluate the performance of individual modules, we used a combination of genomic- and plasmid-encoded genetic circuits that allowed for plug-and-play expression of module components (Fig. 1B). The Output module (O⁺) was created by

integrating an isopropyl β -d-1-thiogalactopyranoside (IPTG)-inducible operon encoding CymA-MtrCAB from *Shewanella oneidensis* MR-1 into the *E. coli* genome and introducing a plasmid that constitutively expresses the cytochrome *c* maturation (*ccm*) operon (20). Strains that express the Input and Coupling modules (I^+ and C^+) components were created by introducing modified *ccm* plasmids that constitutively express a subset of the Input module components (FNR and SIR) and the Coupling module (SQR). Additionally, a second plasmid was introduced that expresses the Fd using an anhydrotetracycline (aTc) inducible promoter. An ET-deficient version of the Input module (I^{C42A}) was created as a negative control by generating a Fd Cys42Ala mutant that cannot coordinate an iron-sulfur cluster (21). To minimize off-pathway ET that competes with the desired electron flux, we used a redox-insulated strain, *E. coli* EW11 (22), as our parental strain. Using different combinations of these plasmids (Table S1), a set of strains (Table S2) were constructed to evaluate the activity of the individual modules and their combinations.

To optimize the function of the Output module, we assayed its expression, EET, and effect on cell fitness under varying induction conditions. The production of the Mtr cytochromes (Fig. S1A) and EET (Fig. S1B) peaked between 2 and 12.5 μ M IPTG. Greater than 10 μ M IPTG decreased $I^{C42A}C^+O^+$ growth significantly relative to $I^{C42A}C^+O^-$ (Fig. S1C). Thus, for all subsequent studies, we induced cells with 10 μ M IPTG to maximize EET while minimizing fitness burdens. Using this optimal induction, we compared $I^{C42A}C^+O^+$ and $I^{C42A}C^+O^-$ anode reduction in a bioelectrochemical system (BES) containing M9 medium and glucose (Fig. 1C). Within 3 h, the $I^{C42A}C^+O^+$ strain produced significantly more current than the $I^{C42A}C^+O^-$ strain (p-value = 0.05), demonstrating the optimized Output module is functional.

Our next step was to identify an SQR for the Coupling module that would rapidly oxidize sulfide at the concentrations produced by the Input module. The cellular activities of two SQR homologs were compared using $I^{C42A}C^{+}O^{-}$ strains, including the SQRs from *Rhodobacter capsulatus* (Rc-SQR) and *Geobacillus stearothermophilus* (Gs-SQR) (23, 24). When cells expressing Rc-SQR or Gs-SQR were exposed to exogenous sulfide, oxidation of 500 μ M sulfide required 7 and 12.5 min, respectively (Fig. 1D). In contrast, cells lacking an SQR did not consume sulfide. When cells were labeled with a fluorescent probe for intracellular sulfane sulfur, an indication of SQR activity (25), both SQR-expressing strains accumulated significantly more sulfane sulfur than the empty vector control (Fig. S2). Because Rc-SQR oxidized sulfide at faster rates, it was used as the Coupling module for all subsequent studies.

To investigate whether the Input module acquires iron cofactors required for ET in the presence of the Output module, which has a high iron cofactor demand, we measured ET mediated by the Input module in the $I^{+}C^{+}O^{+}$ and $I^{+}C^{+}O^{-}$ strains. We leveraged a prior demonstration that growth of our parental strain can be coupled to sulfite reduction by expressing *Mastigocladus laminosus* Fd and *Zea mays* FNR and SIR (21). With this cellular assay, Fd-mediated ET from FNR to SIR is required to synthesize cysteine when sulfate or thiosulfate are provided as a sulfur source (21) (Fig. S3A). Fd complementation was similar in $I^{+}C^{+}O^{+}$ and $I^{+}C^{+}O^{-}$ cells (Fig. 1E). This finding indicates that cells can synthesize holoproteins in the Input module while expressing the Output module.

We predicted that the minimum thiosulfate concentration that our system could ultimately detect would have to be greater than the thiosulfate needed to meet assimilation needs. To establish this lower limit, we evaluated the effect of varying

thiosulfate concentrations on the growth (Fig. S3D) and H₂S evolution (Fig. S3E) from I⁺C⁻O⁻ cultures. Cells added to medium containing ≤0.25 mM thiosulfate as a sulfur source displayed growth complementation that was dependent on Fd expression. At higher thiosulfate concentrations, cells grew to similar densities, suggesting excess thiosulfate was available. In addition, H₂S was only observed when >0.5 mM thiosulfate was added. Taken together, these results suggest that ET through our full synthetic pathway should be measurable when thiosulfate is >0.25 mM, which is lower than its EC₅₀ for fish (4 mM).

To determine if ET through the full synthetic pathway is dependent upon thiosulfate, we integrated all three modules together to build an I⁺C⁺O⁺ strain and measured thiosulfate-dependent EET of these planktonic cells in a BES. Thiosulfate increased the current response of the I⁺C⁺O⁺ strain relative to the I^{C42A}C⁺O⁺ strain (Fig. S4), indicating the full pathway acts as a thiosulfate sensor. However, the signal-to-noise was low, making it challenging to discern the signals from these strains. To investigate if this noise arose from using planktonic cells bound loosely to the anode, we encapsulated each strain with the carbon felt working electrode within an alginate-agarose hydrogel (Fig. 2A-B). Compared to planktonic cells, the encapsulated cells responded to thiosulfate with higher signal-to-noise (>5-fold increase in signal intensity), increased reproducibility (>50% decrease in standard deviation), and enhanced linearity (>10-fold increase in R²) (Fig. 2C-D). This encapsulation approach produces a living electronic sensor, which was used in all subsequent experiments.

We next probed the ability of this living electronic sensor to sense different thiosulfate concentrations. Upon addition of as little as 0.1 mM thiosulfate, the I⁺C⁺O⁺ strain immediately presented increased current, while the sensors with the I^{C42A}C⁺O⁺

strain did not respond to 20 mM thiosulfate (Fig. 2C). The thiosulfate-dependent signal of the $I^+C^+O^+$ strain was calculated as the difference between current immediately before each injection (I_{t_0}) and current at a fixed time after injection ($I_{t_{injection}}$). The current response ($I_{t_{injection}} - I_{t_0}$) is linearly related to the thiosulfate concentration (Fig. 2D) with R^2 of 0.984 and 0.994 for 5 and 30 min, respectively. By comparing the current differences between the $I^{C42A}C^+O^+$ and $I^+C^+O^+$ strains, thiosulfate was detected with $\geq 95\%$ confidence within 2 to 10 min of exposure (Fig. 2E). This analysis detects ≥ 0.4 mM thiosulfate in < 4 min. Thus, electrical signals produced by our engineered strain allow for rapid, continuous detection and quantification of thiosulfate.

To determine if our living electronic sensor can be rapidly diversified to respond to chemicals that affect vertebrate reproduction and health, we leveraged Fd switches that post-translationally gate ET in response to a chemical ligand (21, 26). We replaced the native Fd in our $I^+C^+O^+$ strain with a ligand-gated Fd that contains the estrogen receptor ligand-binding domain (26) and generated a Switch (S) strain (Fig. 3A), designated $I^SC^+O^+$. We encapsulated the $I^SC^+O^+$ and $I^{C42A}C^+O^+$ strains into separate working electrodes, immersed them in the same anodic chamber in a 2-Encapsulated Working Electrodes (2-EWE) configuration (Fig. 3B), and added either DMSO or the endocrine disruptor 4-hydroxytamoxifen (4-HT). To quantify current changes induced by 4-HT, we calculated the percent difference in current of the $I^SC^+O^+$ strain relative to the

$I^{C42A}C^+O^+$ strain $\frac{(I_{I^SC^+O^+} - I_{I^{C42A}C^+O^+})}{I_{I^{C42A}C^+O^+}} * 100\%$. This comparison controls for any systemic environmental changes (e.g., temperature, pH, carbon source) that affect the signal (12). Following 4-HT addition (12.5 μ M), the $I^SC^+O^+$ current increased within a few minutes (Fig. 3C). In contrast, the chemical used to dissolve 4-HT (DMSO) did not change the $I^SC^+O^+$ current relative to $I^{C42A}C^+O^+$. Comparison of the DMSO and 4-HT

signals revealed that 4-HT was detected at 95% confidence in 7.8 min (Fig. 3D). Thus, the $I^S C^+ O^+$ strain responds to 4-HT as designed by producing enhanced current on the minute timescale. This living electronic sensor cuts the response time by a factor of ~4 compared with prior microbial bioelectronic sensors, which require between 0.5 to 5 h to respond to analytes (8–12, 27–29).

To probe if our living electronic sensor functions in complex urban waterway samples, we tested our BES in riverine and marine samples spiked with thiosulfate or 4-HT. Water samples were collected from an urban beach (Galveston Beach) and two bayous (Buffalo Bayou and Brays Bayou) in the Houston Metro Area (Fig. 4A) that vary in pH, solution conductivity, and organic carbon content (Fig. 4B). We first tested thiosulfate sensing using $I^+ C^+ O^+$ and $I^{C42A} C^+ O^+$ strains in a BES having a 2-EWE configuration. In all water samples, thiosulfate (10 mM) addition resulted in a significant increase ($p < 0.05$) in $I^+ C^+ O^+$ current relative to the $I^{C42A} C^+ O^+$ current within 6.5 min (Fig. 4C), demonstrating our 2-EWE sensor functions robustly across urban water samples with different abiotic characteristics.

We next tested our living electronic sensors by adding 4-HT (12.5 μ M) into the urban water samples using 2-EWEs containing the $I^S C^+ O^+$ and $I^{C42A} C^+ O^+$ strains. These water samples had poor conductivity (Fig. 4B) and abundant redox active compounds (Fig. S5), which pose additional challenges relative to laboratory media for bioelectronic sensing. To enhance current collection, we introduced a biocompatible and conductive $TiO_2@TiN$ nanocomposite into the encapsulation matrix (Fig. 4D), which increases the contact surface for strains to deliver electrons and facilitates electron transfer at the bacterial-electrode interface (30). Addition of nanoparticles led to an increase in the

signal-to-noise with a higher steady-state current in the presence of 1 mM thiosulfate (Fig. S6), resulting in a faster response time.

When we used this novel encapsulation approach for urban water sensing, 4-HT caused immediate current increases with $I^{SC}O^+$ across the sampling sites, while DMSO caused no deductible current increase (Fig. 4E). The response times for 4-HT detection were shortened to about 7 min with 95% confidence, with the fastest being less than 2 min. The response time required for 99.9% confidence was slightly longer (Fig. 4F), but always less than 15 min. Using a model of Fickian diffusion (17), we estimated the time required for 4-HT to penetrate the agarose layer and reach the bacteria (Fig S7). The agarose thickness varied between 1-3 mm, yielding a diffusional timescale between 1-8 min that agrees with our fastest response times. Thus, our living electronic sensor specifically detects analytes at environmentally-relevant concentrations and conditions with mass-transfer limited kinetics that are up to 10 times faster than the previous state-of-the-art (8–12, 27–29, 31).

This work describes three parallel innovations beyond previous work (27–29, 31) required to achieve real-time sensing. First, our work introduces synthetic signal transduction using ET, in addition to phosphorylation (32) or proteolysis (33). This allows direct transmission of information and energy from biology to electronics (33). Second, the chemical gating of EET in this work is controlled post-translationally to enable rapid response times that are well suited for continuously monitoring transient chemical exposures in the environment. Third, we leveraged previous innovations in conductive nanomaterials (30) to improve the efficiency of EET within the encapsulation matrix, which amplified the signal and led to mass-transfer limited response times.

The modular approach used herein illustrates engineering principles and opportunities for how miniature bioelectronic devices can be created to enable real time multimodal sensing. In total, this pathway contains oxidoreductases from four different organisms across two domains of life that contain a total of twenty-nine cofactors. This demonstrates that electron transfer can be flexibly and extensively re-wired. This synthetic ET pathway could be adapted to respond to different analytes by inserting a wider range of ligand-binding domains and targeting different module components for switch design (21). To improve and customize this proof-of-concept for long-term environmental deployment, carbon sources and accessory chemicals can be incorporated within the synthetic encapsulation matrix, and these sensors can be incorporated into devices that self-power by scavenging energy present in the environment (34). Additionally, materials engineering can be used to optimize transmission of electrical signals at the abiotic-biotic interface. Small, deployable real-time bioelectronic sensors that can be distributed across different environmental locations will revolutionize our ability to monitor chemicals as they move through ecosystems informing smart sustainable practices in agriculture, mitigating the impacts of industrial waste release, and ensuring water security.

REFERENCES

1. R. P. Schwarzenbach, B. I. Escher, K. Fenner, T. B. Hofstetter, C. A. Johnson, U. von Gunten, B. Wehrli, The challenge of micropollutants in aquatic systems. *Science*. **313**, 1072–1077 (2006).
2. M. G. Ryon, A. J. Stewart, L. A. Kszos, T. L. Phipps, Impacts on Streams from the Use of Sulfur-Based Compounds for Dechlorinating Industrial Effluents. *Water Air Soil Pollut.* **136**, 255–268 (2002).
3. K. A. Kidd, P. J. Blanchfield, K. H. Mills, V. P. Palace, R. E. Evans, J. M. Lazorchak, R. W. Flick, Collapse of a fish population after exposure to a synthetic estrogen. *Proc. Natl. Acad. Sci. U. S. A.* **104**, 8897–8901 (2007).
4. J. Rice, P. Westerhoff, High levels of endocrine pollutants in US streams during low flow due to insufficient wastewater dilution. *Nat. Geosci.* **10**, 587–591 (2017).
5. J. K. Jung, K. K. Alam, M. S. Verosloff, D. A. Capdevila, M. Desmau, P. R. Clauer, J. W. Lee, P. Q. Nguyen, P. A. Pastén, S. J. Matiassek, J.-F. Gaillard, D. P. Giedroc, J. J. Collins, J. B. Lucks, Cell-free biosensors for rapid detection of water contaminants. *Nat. Biotechnol.* **38**, 1451–1459 (2020).
6. L. T. Bereza-Malcolm, G. Mann, A. E. Franks, Environmental sensing of heavy metals through whole cell microbial biosensors: a synthetic biology approach. *ACS Synth. Biol.* **4**, 535–546 (2015).
7. I. Del Valle, E. M. Fulk, P. Kalvapalle, J. J. Silberg, C. A. Masiello, L. B. Stadler, Translating New Synthetic Biology Advances for Biosensing Into the Earth and Environmental Sciences. *Front. Microbiol.* **11**, 618373 (2020).
8. F. Golitsch, C. Bücking, J. Gescher, Proof of principle for an engineered microbial biosensor based on *Shewanella oneidensis* outer membrane protein complexes.

Biosens. Bioelectron. **47**, 285–291 (2013).

9. D. P. Webster, M. A. TerAvest, D. F. R. Doud, A. Chakravorty, E. C. Holmes, C. M. Radens, S. Sureka, J. A. Gralnick, L. T. Angenent, An arsenic-specific biosensor with genetically engineered *Shewanella oneidensis* in a bioelectrochemical system.

Biosens. Bioelectron. **62**, 320–324 (2014).

10. T. Ueki, K. P. Nevin, T. L. Woodard, D. R. Lovley, Genetic switches and related tools for controlling gene expression and electrical outputs of *Geobacter sulfurreducens*. *J. Ind. Microbiol. Biotechnol.* **43**, 1561–1575 (2016).

11. E. A. West, A. Jain, J. A. Gralnick, Engineering a Native Inducible Expression System in *Shewanella oneidensis* to Control Extracellular Electron Transfer. *ACS Synth. Biol.* **6**, 1627–1634 (2017).

12. A. Y. Zhou, M. Baruch, C. M. Ajo-Franklin, M. M. Maharbiz, A portable bioelectronic sensing system (BESSY) for environmental deployment incorporating differential microbial sensing in miniaturized reactors. *PLoS One.* **12**, e0184994 (2017).

13. S. M. Brooks, H. S. Alper, Applications, challenges, and needs for employing synthetic biology beyond the lab. *Nat. Commun.* **12**, 1390 (2021).

14. Y. Kabessa, O. Eyal, O. Bar-On, V. Korouma, S. Yagur-Kroll, S. Belkin, A. J. Agranat, Standoff detection of explosives and buried landmines using fluorescent bacterial sensor cells. *Biosens. Bioelectron.* **79**, 784–788 (2016).

15. T.-C. Tang, E. Tham, X. Liu, K. Yehl, A. J. Rovner, H. Yuk, C. de la Fuente-Nunez, F. J. Isaacs, X. Zhao, T. K. Lu, Hydrogel-based biocontainment of bacteria for continuous sensing and computation. *Nat. Chem. Biol.* (2021).

16. S. Zhao, H. Wen, Y. Ou, M. Li, L. Wang, H. Zhou, B. Di, Z. Yu, C. Hu, A new design for living cell-based biosensors: Microgels with a selectively permeable shell that

can harbor bacterial species. *Sens. Actuators B Chem.* **334**, 129648 (2021).

17. X. Liu, T.-C. Tang, E. Tham, H. Yuk, S. Lin, T. K. Lu, X. Zhao, Stretchable living materials and devices with hydrogel-elastomer hybrids hosting programmed cells.

Proc. Natl. Acad. Sci. U. S. A. **114**, 2200–2205 (2017).

18. O. Bretschger, A. Obraztsova, C. A. Sturm, I. S. Chang, Y. A. Gorby, S. B. Reed, D. E. Culley, C. L. Reardon, S. Barua, M. F. Romine, J. Zhou, A. S. Beliaev, R. Bouhenni, D. Saffarini, F. Mansfeld, B.-H. Kim, J. K. Fredrickson, K. H. Nealson, Current production and metal oxide reduction by *Shewanella oneidensis* MR-1 wild type and mutants. *Appl. Environ. Microbiol.* **73**, 7003–7012 (2007).

19. H. M. Jensen, M. A. TerAvest, M. G. Kokish, C. M. Ajo-Franklin, CymA and Exogenous Flavins Improve Extracellular Electron Transfer and Couple It to Cell Growth in Mtr-Expressing *Escherichia coli*. *ACS Synth. Biol.* **5**, 679–688 (2016).

20. C. P. Goldbeck, H. M. Jensen, M. A. TerAvest, N. Beedle, Y. Appling, M. Hepler, G. Cambray, V. Mutalik, L. T. Angenent, C. M. Ajo-Franklin, Tuning promoter strengths for improved synthesis and function of electron conduits in *Escherichia coli*. *ACS Synth. Biol.* **2**, 150–159 (2013).

21. J. T. Atkinson, I. J. Campbell, E. E. Thomas, S. C. Bonitatibus, S. J. Elliott, G. N. Bennett, J. J. Silberg, Metalloprotein switches that display chemical-dependent electron transfer in cells. *Nat. Chem. Biol.* **15**, 189–195 (2019).

22. B. Barstow, C. M. Agapakis, P. M. Boyle, G. Grandl, P. A. Silver, E. H. Wintermute, A synthetic system links FeFe-hydrogenases to essential *E. coli* sulfur metabolism. *J. Biol. Eng.* **5**, 7 (2011).

23. H. Shibata, S. Kobayashi, Sulfide oxidation in gram-negative bacteria by expression of the sulfide-quinone reductase gene of *Rhodobacter capsulatus* and by electron

transport to ubiquinone. *Can. J. Microbiol.* **47**, 855–860 (2001).

24. H. Shibata, K. Suzuki, S. Kobayashi, Menaquinone reduction by an HMT2-like sulfide dehydrogenase from *Bacillus stearothermophilus*. *Can. J. Microbiol.* **53**, 1091–1100 (2007).

25. H. Liu, K. Fan, H. Li, Q. Wang, Y. Yang, K. Li, Y. Xia, L. Xun, Synthetic Gene Circuits Enable *Escherichia coli* To Use Endogenous H₂S as a Signaling Molecule for Quorum Sensing. *ACS Synth. Biol.* **8**, 2113–2120 (2019).

26. B. Wu, J. T. Atkinson, D. Kahanda, G. N. Bennett, J. J. Silberg, Combinatorial design of chemical□dependent protein switches for controlling intracellular electron transfer. *AIChE J.* **66** (2020).

27. M. Mimee, P. Nadeau, A. Hayward, S. Carim, S. Flanagan, L. Jerger, J. Collins, S. McDonnell, R. Swartwout, R. J. Citorik, V. Bulović, R. Langer, G. Traverso, A. P. Chandrakasan, T. K. Lu, An ingestible bacterial-electronic system to monitor gastrointestinal health. *Science*. **360**, 915–918 (2018).

28. E. VanArsdale, C.-Y. Tsao, Y. Liu, C.-Y. Chen, G. F. Payne, W. E. Bentley, Redox-Based Synthetic Biology Enables Electrochemical Detection of the Herbicides Dicamba and Roundup via Rewired *Escherichia coli*. *ACS Sens.* **4**, 1180–1184 (2019).

29. E. VanArsdale, D. Hörnström, G. Sjöberg, I. Järbur, J. Pitzer, G. F. Payne, A. J. A. van Maris, W. E. Bentley, A Coculture Based Tyrosine-Tyrosinase Electrochemical Gene Circuit for Connecting Cellular Communication with Electronic Networks. *ACS Synth. Biol.* **9**, 1117–1128 (2020).

30. L. Su, T. Yin, H. Du, W. Zhang, D. Fu, Synergistic improvement of *Shewanella loihica* PV-4 extracellular electron transfer using a TiO₂@TiN nanocomposite.

Bioelectrochemistry. **134**, 107519 (2020).

31. J. L. Terrell, T. Tschirhart, J. P. Jahnke, K. Stephens, Y. Liu, H. Dong, M. M. Hurley, M. Pozo, R. McKay, C. Y. Tsao, H.-C. Wu, G. Vora, G. F. Payne, D. N. Stratis-Cullum, W. E. Bentley, Bioelectronic control of a microbial community using surface-assembled electrogenetic cells to route signals. *Nat. Nanotechnol.* (2021).
32. R. M. Gordley, R. E. Williams, C. J. Bashor, J. E. Toettcher, S. Yan, W. A. Lim, Engineering dynamical control of cell fate switching using synthetic phosphoregulons. *Proc. Natl. Acad. Sci. U. S. A.* **113**, 13528–13533 (2016).
33. X. J. Gao, L. S. Chong, M. S. Kim, M. B. Elowitz, Programmable protein circuits in living cells. *Science*. **361** (2018), pp. 1252–1258.
34. C. E. Reimers, L. M. Tender, S. Fertig, W. Wang, Harvesting Energy from the Marine Sediment–Water Interface. *Environmental Science & Technology*. **35** (2001), pp. 192–195.
35. J. M. Monk, A. Koza, M. A. Campodonico, D. Machado, J. M. Seoane, B. O. Palsson, M. J. Herrgård, A. M. Feist, Multi-omics Quantification of Species Variation of *Escherichia coli* Links Molecular Features with Strain Phenotypes. *Cell Syst.* **3**, 238–251.e12 (2016).
36. C. Pinske, M. Bönn, S. Krüger, U. Lindenstrauss, R. G. Sawers, Metabolic deficiencies revealed in the biotechnologically important model bacterium *Escherichia coli* BL21(DE3). *PLoS One*. **6**, e22830 (2011).
37. S. Spiro, J. R. Guest, Adaptive responses to oxygen limitation in *Escherichia coli*. *Trends Biochem. Sci.* **16**, 310–314 (1991).
38. H. Kim, S. Kim, S. H. Yoon, Metabolic network reconstruction and phenome analysis of the industrial microbe, *Escherichia coli* BL21(DE3). *PLoS One*. **13**,

e0204375 (2018).

39. U. Sauer, F. Canonaco, S. Heri, A. Perrenoud, E. Fischer, The soluble and membrane-bound transhydrogenases UdhA and PntAB have divergent functions in NADPH metabolism of *Escherichia coli*. *J. Biol. Chem.* 279, 6613–6619 (2004).

40. J. Fan, J. Ye, J. J. Kamphorst, T. Shlomi, C. B. Thompson, J. D. Rabinowitz, Quantitative flux analysis reveals folate-dependent NADPH production. *Nature*. 510, 298–302 (2014).

41. C. Engler, R. Kandzia, S. Marillonnet, A one pot, one step, precision cloning method with high throughput capability. *PLoS One*. 3, e3647 (2008).

42. D. G. Gibson, L. Young, R.-Y. Chuang, J. C. Venter, C. A. Hutchison 3rd, H. O. Smith, Enzymatic assembly of DNA molecules up to several hundred kilobases. *Nat. Methods*. 6, 343–345 (2009).

43. J. P. Torella, F. Lienert, C. R. Boehm, J.-H. Chen, J. C. Way, P. A. Silver, Unique nucleotide sequence-guided assembly of repetitive DNA parts for synthetic biology applications. *Nat. Protoc.* 9, 2075–2089 (2014).

44. M. C. Bassalo, A. D. Garst, A. L. Halweg-Edwards, W. C. Grau, D. W. Domaille, V. K. Mutalik, A. P. Arkin, R. T. Gill, Rapid and Efficient One-Step Metabolic Pathway Integration in *E. coli*. *ACS Synth. Biol.* 5, 561–568 (2016).

45. S. Datta, N. Costantino, D. L. Court, A set of recombineering plasmids for gram-negative bacteria. *Gene*. 379, 109–115 (2006).

46. L. Su, T. Fukushima, A. Prior, M. Baruch, T. J. Zajdel, C. M. Ajo-Franklin, Modifying Cytochrome c Maturation Can Increase the Bioelectronic Performance of Engineered *Escherichia coli*. *ACS Synth. Biol.* 9, 115–124 (2020).

47. Y. Zhang, J. H. Weiner, A simple semi-quantitative in vivo method using H₂S

detection to monitor sulfide metabolizing enzymes. *Biotechniques*. 57, 208–210 (2014).

48. N. Fatin-Rouge, K. Starchev, J. Buffle, Size effects on diffusion processes within agarose gels. *Biophys. J.* 86, 2710–2719 (2004).

49. R. E. Sabzi, Electrocatalytic oxidation of thiosulfate at glassy carbon electrode chemically modified with cobalt pentacyanonitrosylferrate. *J. Braz. Chem. Soc.* 16, 1262–1268 (2005).

50. S. Korshunov, K. R. C. Imlay, J. A. Imlay, The cytochrome bd oxidase of *Escherichia coli* prevents respiratory inhibition by endogenous and exogenous hydrogen sulfide. *Mol. Microbiol.* 101, 62–77 (2016).

51. S. Park, J. A. Imlay, High levels of intracellular cysteine promote oxidative DNA damage by driving the fenton reaction. *J. Bacteriol.* 185, 1942–1950 (2003).

52. T. Nakatani, I. Ohtsu, G. Nonaka, N. Wiriyanawudhiwong, S. Morigasaki, H. Takagi, Enhancement of thioredoxin/glutaredoxin-mediated L-cysteine synthesis from S-sulfocysteine increases L-cysteine production in *Escherichia coli*. *Microb. Cell Fact.* 11, 62 (2012).

53. R. Entus, B. Aufderheide, H. M. Sauro, Design and implementation of three incoherent feed-forward motif based biological concentration sensors. *Syst. Synth. Biol.* 1, 119–128 (2007).

54. S. Kaplan, A. Bren, E. Dekel, U. Alon, The incoherent feed-forward loop can generate non-monotonic input functions for genes. *Mol. Syst. Biol.* 4, 203 (2008).

ACKNOWLEDGMENTS

E. coli EW11 and the genes encoding FNR, and SIR were a gift from Dr. Pamela Silver (Harvard University). pSIM19 was a gift from Dr. Don Court (NIH-National Cancer Institute). pSS9 (Addgene plasmid #71655), pSS9-RNA (Addgene plasmid #71656), and pX2-Cas9 (Addgene plasmid #8581) were gifts from Dr. Ryan Gill (University of Colorado). Water sampling with help from Siliang Li (Rice University). TOC measurements with the help from Dr. Xiao Chen and Dr. Caroline Masiello (Rice University). We also thank Dr. Moshe Baruch (Rice University) for helping conceptualize the project.

FUNDING

Office of Science, Office of Basic Energy Sciences of the U.S. Department of Energy grants DE-SC0014462 (JJS, GNB); Office of Naval Research grants 0001418IP00037 (CMAF), N00014-17-1-2639 (JJS), and N00014-20-1-2274 (CMAF, JJS); Cancer Prevention and Research Institute of Texas RR190063 (CMAF); National Science Foundation grant 1843556 (JJS, GNB); Department of Energy Office of Science Graduate Student Research (SCGSR) Program Fellowship DE-SC0014664 (JTA); Loideska Stockbridge Vaughn Fellowship (JTA); and China Scholarship Council Fellowship CSC-201606090098 (LS). Work at the Molecular Foundry was supported by the Office of Science, Office of Basic Energy Sciences, of the U.S. Department of Energy under Contract No. DE-AC02-05CH11231.

AUTHOR CONTRIBUTIONS

Contributions are noted in alphabetical order.

Conceptualization: CMAF, JTA, JJS, LS, XZ

Methodology: JTA, LS, XZ

5 Investigation: JTA, LS, XZ

Visualization: JTA, LS, XZ

Funding acquisition: CMAF, GNB, JJS

Project administration: CMAF, JJS

Supervision: CMAF, JJS

10 Writing – original draft: CMAF, JTA, JJS, LS, XZ

Writing – review & editing: CMAF, JTA, GNB, JJS, LS, XZ

COMPETING INTERESTS

J.J.S., J.T.A., and G.N.B. have submitted a patent application (No 16/186,226) covering the use of fragmented proteins as chemical-dependent electron carriers, entitled “Regulating electron flow using fragmented proteins.”

5

DATA AND MATERIALS AVAILABILITY

Genetic constructs will be made available in Addgene.

SUPPLEMENTARY MATERIALS

10 Materials and Methods

Supplementary Text

Fig S1 – S7

Table S1 – S2

References (35 – 52)

15

FIGURE LEGENDS

Fig. 1. An *E. coli* sensor with a synthetic electron transfer chain. (A) Fd-dependent ET from FNR to SIR couples NADPH oxidation to sulfite reduction (Input module), SQR uses sulfide oxidation to reduce quinones (Coupling module), and CymA-MtrCAB use quinol oxidation to drive EET (Output module). **(B)** Genetic circuits for expressing the different modules. **(C)** Current production in a BES containing either $I^{C42A}C^+O^+$ (red) or $I^{C42A}C^-O^-$ (black). Current from $I^{C42A}C^+O^+$ was significantly greater than $I^{C42A}C^-O^-$ 3 h after introduction to the BES ($p = 0.05$). **(D)** Sulfide oxidation by $I^{C42A}C^-O^-$ cells expressing *Rc*-SQR (yellow, $370 \mu\text{mol s}^{-1}$) and *Gs*-SQR (orange, $230 \mu\text{mol s}^{-1}$) are significantly faster than cells lacking SQR (black, $5.7 \mu\text{mol s}^{-1}$) ($p < 0.01$). **(E)** The optical density of $I^+C^+O^+$ (blue triangles) $I^+C^-O^-$ (blue circles) cultures increase with aTc concentration. In contrast, $I^+C^+O^+$ and $I^+C^-O^-$ both present significantly higher growth complementation than $I^{C42A}C^-O^-$ and $I^{C42A}C^+O^+$ (black circles and triangles, respectively) upon Fd induction at $\geq 3.125 \text{ ng/mL}$ aTc ($p < 0.05$). Data represents the mean values with error bars representing one standard deviation ($n = 3$ biologically independent samples). P values were obtained using two-tailed, independent t-tests.

Fig. 2. Encapsulation of a living electronic sensor yields rapid detection and quantification of thiosulfate. (A) Schematic depicting the protocol for encapsulating the living electronic sensor with an electrode and **(B)** an image of the encapsulated sensor. **(C)** Current generated by the $I^+C^+O^+$ and $I^{C42A}C^+O^+$ strains upon exposure to increasing concentrations of thiosulfate. **(D)** Average current response are a linear function of thiosulfate concentration at 5 ($R^2 = 0.984$) and 30 min ($R^2 = 0.994$) after thiosulfate addition. **(E)** Detection time for different thiosulfate concentrations ($p < 0.05$).

Data represents the mean values with error bars representing one standard deviation ($n = 3$ biologically independent samples). P values were calculated using a one-way ANOVA with Tukey test.

Fig. 3. Living electronic sensors expressing an electrical protein switch yield

rapid detection of an endocrine disruptor. (A) Schematic depicting a ligand-dependent Fd whose ET is regulated by 4-HT. **(B)** Schematic of the 2-EWE configured BES for 4-HT sensing, which contains two working electrodes: one encapsulating the $I^S C^+ O^+$ strain, and the other containing the $I^{C42A} C^+ O^+$ strain. **(C)** Percent increase in current of $I^S C^+ O^+$ relative to $I^{C42A} C^+ O^+$ upon addition of DMSO or 4-HT in the 2-EWE configured BES. **(D)** Percent increase in current of $I^S C^+ O^+$ relative to $I^{C42A} C^+ O^+$ at different times following addition of DMSO or 4-HT. The times shown represent 4-HT detection with 95%(*), 99%(**), and 99.9%(***) confidence in 7.8 min (0.9% increase), 15.6 min (1.4% increase), and 18.6 min (1.6 % increase), respectively. Data represents the mean values with error bars representing one standard deviation ($n = 3$ biologically independent samples). P values were calculated using a one-way ANOVA with Tukey test.

Fig. 4. Living electronic sensors encapsulated with conductive nanoparticles

enable rapid detection of pollutants in environmental samples. (A) Map of urban water sampling locations. **(B)** pH, solution resistance, and total organic carbon (TOC) measurements from each sample is compared with M9 medium. The pH ranged from 6.85 to 8.04, solution resistance ranged from 0.044 to 3.787 k Ω , and TOC ranged from 0 to 17.05 mg L⁻¹. **(C)** The percent increase in current of $I^+ C^+ O^+$ relative to $I^{C42A} C^+ O^+$ upon addition of thiosulfate in a 2-EWE configured BES using each environmental

sample. Data represents the values from a single experiment in each environmental sample (n = 1 biologically independent samples). **(D)** Scheme illustrating the encapsulation with TiO₂@TiN nanoparticles to enhance EET efficiency. **(E)** The percent increase in current of I^SC⁺O⁺ relative to I^{C42A}C⁺O⁺ upon addition of either 4HT or DMSO in a 2-EWE configured BES using each environmental sample. **(F)** Detection time for 4-HT with 95%(*), 99%(**), and 99.9%(***) confidence. Data in panel E and F represents the mean values with error bars representing standard deviation (n = 2 biologically independent samples). P values were calculated using a one-way ANOVA with Tukey test.

5

Figure 1

Figure 2

Figure 3

Figure 4