

# Identification of Three Antimicrobials Activating Serotonin Receptor 4 in Colon Cells

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Supporting Information

**ABSTRACT:** The serotonin receptor 4b (5-HTR<sub>4b</sub>) is expressed throughout the gastrointestinal tract, and its agonists are used in the treatment of irritable bowel syndrome with constipation (IBS-C). Today, there are no rapid assays for the identification of 5-HTR<sub>4b</sub> agonists. Here, we developed a luciferase-based 5-HTR<sub>4b</sub> assay capable of assessing one compound per second with a 38-fold dynamic range and nM limit of detection for serotonin. We used the assay to screen more than 1000 natural products and antiinfection agents and identified five new 5-HTR<sub>4b</sub> ligands: hordenine, halofuginone, proflavine, ethacridine, and revaprazan. We demonstrate that hordenine (antibiofilm), halofuginone (antiparasitic), and revaprazan (gastric acid reducer) activate 5-HTR<sub>4b</sub> in human colon epithelial cells, leading to increased cell motility or wound healing. The 5-HTR<sub>4b</sub> assay can be used to



screen larger pharmaceutical libraries to identify novel treatments for IBS-C. This work shows that antimicrobials interact not only with the gut microbiota, but also with the human host.

**KEYWORDS:** serotonin receptor, high-throughput screen, hordenine, halofuginone, revaprazan

I n humans, 95% of serotonin (5-HT) is found in the gastrointestinal (GI) tract,<sup>1</sup> where release and reception of 5-HT transmits information from the gut lumen to gut nerve cells and smooth muscles. Of the seven 5-HT receptor families, 5-HTR<sub>4</sub> is broadly expressed in the gut: on nitrergic neurons that control smooth muscle relaxation, cholinergic and nitrergic neurons that control chemical transport, and enteroendocrine cells that control the secretion of gastrointestinal hormones.<sup>2,3</sup> Specifically, 5-HTR<sub>4</sub> has been implicated in irritable bowel syndrome (IBS), which affects 15% of the world population.<sup>4,5</sup> Agonists of 5-HTR<sub>4</sub> are used for the treatment of irritable bowel syndrome with constipation (IBS-C), relieving constipation, abdominal pain, and bloating.

One of the major challenges in identifying novel 5-HTR<sub>4</sub> agonists is the dearth of 5-HTR high-throughput assays to rapidly assess large libraries of chemicals. The two-day culture time required to test cell motility using colon cells, which naturally express 5-HTR<sub>4</sub>, would be time-prohibitive for a primary screening tool. Commercial G-protein coupled receptor (GPCR)-based assays, such as SelectScreen (Thermo Fisher) and gpcrMAX<sup>SM</sup> (Eurofins) lack screens for any member of the 5-HTR<sub>4</sub> family. To our knowledge, only one large-scale 5-HTR<sub>4</sub> screen has been performed to date, against 976 ToxCast chemicals using guinea pig brain tissue and radio-labeled ligand displacement.<sup>6</sup>

Previously, we engineered a fluorescence-based  $5\text{-HTR}_{4b}$  assay in yeast by linking expression of human  $5\text{-HTR}_{4b}$  on the yeast surface to green fluorescent protein (GFP) expression.<sup>7</sup> The fluorescent reporter, however, posed some practical limitations. Fluorescent readout requires a 4 h chemical incubation step for robust GFP expression, and a high-throughput flow cytometer for signal readout, thus limiting the assay throughput to one 96-well plate per hour. Additionally, the GFP-based 5-HTR<sub>4</sub> assay has only a 3-fold dynamic range and one order of magnitude linear range after activation with serotonin.

Here, we developed a luciferase-based 5-HTR<sub>4b</sub> assay with an overall assay time of 2.5 h, enabling the use of a luminescent plate reader, and achieving a screening throughput of one compound per second. Next, we used the assay to screen 1206 compounds coming from two commercial chemical libraries, a natural products library and an anti-infection library, and discovered five previously unidentified 5-HTR<sub>4b</sub> ligands. We validated three of the five ligands, hordenine, halofuginone, and revaprazan, as 5-HTR<sub>4b</sub> agonists in mammalian cells as they increase motility or wound healing in human colon epithelial cells. (Figure 1A).

This work has three significant outcomes. First, the same compound discovery workflow can be used, in the future, to

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Figure 1. Luciferase-based 5-HTR<sub>4</sub> assay development. (A) Workflow for the identification and validation of HTR<sub>4b</sub> agonists. (B) Luciferase-based 5-HTR<sub>4</sub> assay: human 5-HTR<sub>4b</sub> was expressed on the cell surface of a yeast engineered to link receptor activation to reporter to luciferase gene expression *via* the yeast mating pathway. (C) 5-HTR<sub>4</sub>-assay optimization at a pH = 7 and 100 mg/L serotonin.

screen pharmaceutical libraries for the identification of novel 5-HTR<sub>4b</sub> agonists for the treatment of IBS-C. Second, the increased assay signal provided by the luciferase reporter, when compared to the GFP reporter, should enable the generation of other high-throughput GPCR-based assays by simply swapping the receptor from the cell surface. Third, as antibiofilm (hordenine) and antiparasitic (halofuginone) agents affect colon cell motility and/or wound healing, antimicrobials may interact not only with the gut microbiota, but also with the human host leading to potential changes in gut movement and secretion. Finally, with a 5-HTR<sub>4b</sub> high-throughput assay in hand, we can now screen gut microbiota metabolites to further understand the link between host and gut microbiome.

# RESULTS

**Luciferase-Based 5-HTR**<sub>4b</sub> **Assay Development.** We replaced the GFP reporter from our GFP-based 5-HTR<sub>4b</sub> assay<sup>7</sup> with NanoLuc luciferase,<sup>8</sup> which we optimized for yeast expression (Figure 1B). As the pH of the GI tract hovers between 5.7 and 7.4, we optimized the assay at a pH of 7. The 5-HTR<sub>4b</sub> assay is composed of two steps, (i) ligand incubation leading to luciferase expression, and (ii) luciferase substrate incubation leading to luminescence. By co-optimizing both incubation steps using serotonin, we concluded that a 2 h ligand incubation results in the fastest overall assay conditions (2.5 h) with the highest signal increase after activation (38-fold) (Figure 1C). Of note, multiple 96-well plates can be incubated simultaneously, as reading the plate for luminescence takes 2 min.

Luciferase-Based 5-HTR<sub>4b</sub> Assay Validation. We demonstrate that the assay detects three known 5-HTR<sub>4</sub> agonists for the treatment of IBS-C: tegaserod, prucalopride, and mosapride,<sup>9,10</sup> and four other agonists used to treat gastroesophageal reflux (cisapride),<sup>11</sup> depression (RS67333),<sup>1</sup> anxiety (zacopride),<sup>13</sup> and nausea (metoclopramide)<sup>10,14</sup> (Figure 2A-H). To verify that the agonists led to cell luminescence due to 5-HTR<sub>4b</sub> activation and not via an alternative mechanism, we performed dose response curves with the agonists using a control strain carrying the luciferase reporter plasmid and a blank plasmid in lieu of 5-HTR<sub>4b</sub>. On the basis of  $EC_{50}$ s, the potency of the agonists toward 5-HTR<sub>4b</sub> are tegaserod (0.3 nM) > RS67333 (11.0 nM) > prucalopride (41.0 nM) > cisapride (69.9 nM) > serotonin (155.0 nM) >mosapride (256.4nM) > zacopride (616.0 nM) > metoclopramide (7.4  $\mu$ M). These results agree with previous studies that identified tegaserod and RS67333 to be more potent than serotonin,<sup>15,16</sup> and zacopride and metoclopramide to be less potent.<sup>17–19</sup> Taken together, the luciferase-based HTR<sub>4b</sub> assay is capable of identifying drugs with  $EC_{50}$ s ranging from the low nM to the  $\mu$ M level.

**5-HTR**<sub>4b</sub> Assay High-Throughput Screening Validation. We validated the assay for 96-well plate high-throughput screening using a 3-day plate uniformity experiment<sup>20</sup> (Figure S1). The assay had an average Z factor of 0.74 and an average coefficient of variation of 7.7%, meeting the two statistical parameters for high-throughput assay acceptance, *i.e.*, a Z factor of >0.5<sup>21</sup> and a CV < 10%.<sup>22</sup>

**Identifying Novel 5-HTR**<sub>4b</sub> Ligands. GPCRs expressed in the GI tract tend to bind gut microbial metabolites. For



Figure 2. Validation of the 5-HTR<sub>4</sub> assay. 5-HTR<sub>4</sub> assay dose response curves with known 5-HTR<sub>4</sub> agonists: (A) cisapride, (B) metoclopramide, (C) mosapride, (D) prucalopride, (E) RS-67333, (F) serotonin, (G) tegaserod, (H) zacopride. Data was collected in triplicate. Shown are means  $\pm$  s.d.

example, GPR41, GPR43, and GPR109 bind microbiota produced short chain fatty acids.<sup>23-25</sup> We hypothesize that 5-HTR<sub>4b</sub> may bind microbial natural products. To explore the range of biological compounds that 5-HTR<sub>4b</sub> may bind, we used the assay to screen a commercial 803-member chemical natural products library. First, to understand the chemical diversity of the library, we broke down each library member into 23 chemical descriptors to perform a principal component analysis (Figure 3A, Table S4). The principal components (PC axes) reflect the common and unique variances of the chemical descriptors with the top three PCs accounting for 64% of the cumulative variances, with PC1, PC2, and PC3 capturing 45%, 11%, and 8% of the total variance, respectively. On the basis of their PC scores, chemicals can be separated into eight chemical spaces (CS) (Table S5). All chemical spaces are populated by compounds in the natural products library, indicating its chemical diversity. CS3, composed of small heteroaromatics with O-containing functionality, is the highest populated CS, containing 22% of all chemicals in the library. The least populated CSs are CS5 and CS7, each containing 6% of all the chemicals tested. In the future, the chemical diversity of the library could be improved by introducing more compounds with chiral centers and cyclic rings.

The screening of the natural products library resulted in 12 hits: serotonin, tryptamine, 3-indolebutyric acid, L-5-hydroxy-tryptophan (L-5-HTP), D/L-5-hydroxytryptophan (5-HTP), hordenine, genistin, neomangiferin, baohuoside I, baicalein, halofuginone, and nalidixic acid (Figure 3B). Previously,

tryptamine<sup>26</sup> and 5-HTP<sup>27</sup> have been shown to bind 5-HTR<sub>4</sub>, and baicalein<sup>28</sup> has been shown to bind 5-HTR<sub>7</sub>. Hordenine, nalidixic acid, halofuginone, 3-indolebutyric acid, genistin neomangiferin, and baohuoside I have not been previously shown to bind 5-HTR<sub>4</sub>.<sup>29</sup>

To confirm the natural products library hits, we ran dose response curves using the 5-HTR<sub>4b</sub> assay strain, and a control strain carrying the luciferase reporter and a blank plasmid in lieu of 5-HTR<sub>4b</sub>. We confirmed tryptamine and 5-HTP to be ligands of 5-HTR<sub>4</sub>. We could not confirm 3-indolebutyric acid, nalidixic acid, baicalein, genistin, baohuoside I, and neomangiferin as ligands of 5-HTR<sub>4b</sub> (Figure S2). We find, for the first time, that hordenine (EC<sub>50</sub> 102.4  $\mu$ M) and halofuginone (EC<sub>50</sub> 1.2  $\mu$ M) are HTR<sub>4b</sub> ligands (Figure 3C). Except for L-5-HTP, all natural products hits, *i.e.*, hordenine, tryptamine, serotonin, and halofuginone, belong to CS8.

High-Throughput Screening of a 403-Member Antiinfection Library. Hordenine has antibiofilm activity against *Pseudomonas aeruginosa*,<sup>30</sup> and halofuginone is used for the treatment and prophylaxis of cryptosporidiosis in ruminants.<sup>31</sup> Intrigued by the fact that antimicrobial agents activate 5-HTR<sub>4b</sub>, we explored whether other antimicrobials activate 5-HTR<sub>4b</sub>. To do this, we screened a commercial 403-member anti-infection library at two chemical concentrations: (i) 10  $\mu$ M, the same concentration used to screen the natural products library, and (ii) 1  $\mu$ M due to potential toxicity effects of the anti-infection compounds on yeast. On the basis of Z-scores, the 10  $\mu$ M screen resulted in four hits: proflavine, ethidium



Figure 3. 5-HTR<sub>4</sub> assay identifies natural products as novel ligands. (A) Principal component analysis of natural products library with 5-HTR<sub>4b</sub> screening hits highlighted. (B) 803-member natural product library screening results. The compounds were screened using the 5-HTR<sub>4b</sub> assay in singlets. Z-scores were normalized to the serotonin positive control, which was set to 1 (dotted line). (C) Dose response curves of the 4 validated natural product hits. Data was collected in triplicate. Shown are means  $\pm$  s.d.

bromide, ethacridine, and hordenine, while the 1  $\mu$ M screen also resulted in four hits: isepamicin, osalmid, revaprazan, and borneol (Figure 4A). We attribute the absence of 1  $\mu$ M hits in the 10  $\mu$ M screen to toxicity issues, given that the 5-HTR<sub>4b</sub> assay is in cells. Neither proflavine, ethacridine, nor revaprazan have been previously shown to activate any serotonin receptor.<sup>29</sup>

To confirm the anti-infection library hits, we ran dose response curves using the 5-HTR<sub>4b</sub> assay strain, and a control strain carrying the luciferase reporter and a blank plasmid in lieu of 5-HTR<sub>4b</sub>. We confirmed proflavine (EC<sub>50</sub> 6  $\mu$ M), ethacridine (EC<sub>50</sub> 2.9  $\mu$ M), and revaprazan (EC<sub>50</sub> 270 nM) as HTR<sub>4b</sub> ligands (Figure 4B). We noticed a sharp decline in receptor activation at high compound concentrations. A toxicity assessment of these compounds shows they are toxic at high concentrations (Figure 4C). We could not confirm ethidium bromide, isepamicin, osalmid, or borneol as 5-HTR<sub>4b</sub> ligands (Figure S3).

Validating 5-HTR<sub>4b</sub> Ligands *via* Wound Healing and Motility Assays in Colon Epithelial Cells. To assess the biological relevance of the five 5-HTR<sub>4b</sub> identified ligands, we tested their ability to activate 5-HTR<sub>4b</sub> in mammalian cells by inducing cell motility and wound healing in human colon epithelial cells (Caco-2). Caco-2 cells endogenously express 5-HTR<sub>4</sub><sup>32</sup> and activation of 5-HTR<sub>4</sub> using the agonist tegaserod leads to increased cell motility, wound healing, and cell proliferation.<sup>32</sup> Tegaserod (Zelmac) is used for the treatment of IBS-C. To test cell motility, we used culture inserts to create a cell free zone to avoid cell death and damage.<sup>33</sup> Revaprazan and hordenine significantly (P < 0.01) increase cell motility (Figure 5A,B). Wound healing was tested by creating a scratch in the cell monolayer using a pipet tip. This more closely mimics *in vivo* wound healing by creating cell damage, such as increasing reactive oxygen species at the wound boundary.<sup>34</sup> Incubation of Caco-2 cells with hordenine, halofuginone, and revaprazan resulted in a statistically significant increase in wound healing (P < 0.05) when compared to the buffer control (Figure 5C,D). Proflavine and ethacridine did not result in a significant increase in either colon cell motility or wound healing. Taken together, revaprazan and hordenine results in both increased cell motility and wound healing, while halofuginone results only in increased wound healing.

Relevance of the Newly Identified 5-HTR<sub>4b</sub> Agonists in the Gut. Hordenine is present in malted barley and beer (strong beer: 5.16 mg/L; Pilsner: 2.7 mg/L<sup>35,36</sup>). Assuming all hordenine consumed reaches the colon, a pint of Pilsner beer would need to be ingested to reach concentrations that were observed to increase colon cell motility and wound healing. Other sources of hordenine are athletic performance and weight loss supplements.<sup>37</sup>

Halofuginone is used for the treatment and prophylaxis of cryptosporidiosis in ruminants<sup>31</sup> with a maximum residue limit of  $10-30 \ \mu g$  in bovine muscle, fat, kidney, and liver.<sup>38</sup> Chickens treated with halofuginone can expect to lay eggs with up to 60  $\ \mu g/kg$  halofuginone.<sup>39</sup> One may only need to eat half a jumbo egg to reach the levels seen to increase colon cell wound healing, assuming all halofuginone reaches the colon.

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**Figure 4.** Screening of a 403 member anti-infective library. (A) Anti-infective compound screening results at 10  $\mu$ M (top) and 1  $\mu$ M (bottom). The compounds were screened using the 5-HTR<sub>4b</sub> assay in singlets. Z-scores were normalized to the serotonin positive control, which was set to 1 (dotted line). (B) Dose response curves of the 3 validated anti-infective hits. (C) Toxicity results after yeast was incubated for 2.5 h with varying concentration of the anti-infective hits. Data was collected in triplicate. Shown are means  $\pm$  s.d.



**Figure 5.** Antimicrobials enhanced colon epithelial cell motility and wound healing. (A) Representative photomicrographs of the colon cell (Caco-2) migration assay after 48 h with phosphate buffer control (PBS), tegaserod (5-HTR<sub>4B</sub> agonist, 1  $\mu$ M), serotonin (1  $\mu$ M), and the five 5-HTR<sub>4B</sub> ligands (10  $\mu$ M). For all photomicrographs for migration after 24 and 48 h, see Figure S4. (B) Quantification of the colon cell migration assay after 48 h. The cell migration elicited by revaprazan and hordenine is similar to that observed by serotonin and tegaserod, and it is statistically significantly different than the PBS control (*P* < 0.01). (C) Representative photomicrographs of the Caco-2 wound healing scratch assay after 48 h with control (PBS), tegaserod (1  $\mu$ M), serotonin (10  $\mu$ M), and the 5 identified 5-HTR<sub>4B</sub> ligands (10  $\mu$ M). For all photomicrographs of the wound healing scratch assay after 24 and 48 h, see Figure S5. (D) Quantification of the colon cell wound healing scratch assay. The wound healing elicited by revaprazan, halofuginone, and hordenine is statistically significantly different than the PBS control (*P* < 0.05).

Revaprazan is a proton pump inhibitor that reduces gastric acid secretion and reduces inflammation caused by *Helicobacter pylori*.<sup>40</sup> At a daily dose of 200 mg/day and assuming it all

reaches the colon, the concentration of revaprazan in the gut would be 983.6  $\mu$ M, which is more than 3000 times higher than the EC<sub>50</sub> of 270 nM.

# DISCUSSION

We have developed a rapid and robust luciferase-based 5-HTR<sub>4b</sub> assay in yeast with a 38-fold dynamic range and a limit of detection in the nM level for serotonin. We applied this assay to screen more than 1000 chemicals and identified five new 5-HTR<sub>4b</sub> ligands. Three of these ligands, hordenine, halofuginone, and revaprazan, activate 5-HTR<sub>4b</sub> in mammalian cells, eliciting colon cell motility and/or wound healing. The 5-HTR<sub>4b</sub> assay can now be used to screen large pharmaceutical libraries to identify 5-HTR<sub>4b</sub> agonists for the treatment of IBS-C. The increased sensitivity of the 5-HTR<sub>4b</sub> luciferase assay over our previous GFP-based assay should enable the generation of assays for other 5-HTRs, including 5-HTR<sub>1</sub>, the pharmaceutical target of antidepressant drugs.<sup>41</sup>

A current limitation of the luciferase-based 5-HTR<sub>4b</sub> assay is the relative high background in the no receptor control. In the absence of receptor, there is free floating  $G_{\alpha\beta\lambda}$ , which does not need to be dissociated to activate the kinase cascade leading to increased gene expression.<sup>42</sup> Sequestering  $G_{\alpha\beta\lambda}$  by expression of the yeast endogenous GPCR (Ste2) may reduce basal luciferase levels in the control strain. Additionally, mixtures of heterologous GPCR/Ste2 in the sensor strains could achieve lower basal expression, but the system would have to be tuned.

The identification of antimicrobials binding 5-HTR<sub>4</sub> is of profound impact to understanding conditions mediated by serotonin receptors. As shown in this work, antimicrobials may not only interact with the gut microbiota, but also with the human host leading to potential changes in gut movement and secretion. Changes in bowel movements and gastrointestinal hormone secretion may at least be partially caused by activation of serotonin receptors. Thus, our findings have implications for the treatment of IBS-C, which can be treated using antibiotics,<sup>43</sup> and more generally to conditions related to serotonin receptor activation, such as depression. Finally, although antimicrobials have not been extensively considered as activating GPCRs, the availability of this high-throughput GPCR assay will enable the analysis of other GPCRs for their binding of antimicrobials.

## METHODS

Luciferase-Based 5-HTR<sub>4b</sub> Assay Construction. Nano-Luc was codon optimized for *Saccharomyces cerevisiae*, commercially synthesized and cloned into pKM586<sup>44</sup> between *NcoI* and *NheI* to generate pRS415-Leu2-pFIG1-NanoLuc (pEY15). pEY15 was sequenced verified using primer EY248. To construct the 5-HTR<sub>4b</sub> assay, pEY15, and pESC-His3pTEF1-HTR4 (pTMC18<sup>7</sup>) were cotransformed into the PPY140<sup>44</sup> (W303  $\Delta far1 \Delta ste2$ ,  $\Delta ss2$ ) to generate PPY1808. To construct the controls strain lacking 5-HTR<sub>4b</sub>, PPY140 was cotransformed with pEY15 and an empty vector (PPY111) to generate PPY1809.

**Luciferase-Based 5-HTR**<sub>4b</sub> **Assay.** Serotonin Detection. An overnight culture of PPY1808 was used to inoculate 20 mL of synthetic complete medium with 2% glucose lacking histidine and leucine (SD(HL<sup>-</sup>) to an OD<sub>600</sub> = 0.06. After 18 h at 15 °C (150 rpm), PPY1808 was centrifuged (3500 rpm, 10 min), and resuspended to an OD<sub>600</sub> = 1. In a white flat bottom 96-well plate, 190  $\mu$ L of pH = 7 SD(HL<sup>-</sup>), 8  $\mu$ L of PPY1808, and 2  $\mu$ L of serotonin (final concentrations 0–4.3 mM) were added. After the chemical incubation step (2 h, plates covered with Breathe Easy Sealing Membrane, 30 °C, 250 rpm), 20  $\mu$ L of 1:100 mixture of NanoLuc substrate to NanoLuc buffer was added<sup>45</sup> for the luciferase substrate incubation step well (30 min, plates covered with Breathe Easy Sealing Membrane, 30  $^{\circ}$ C, 250 rpm). Luminescence was read immediately after luciferase substrate incubation in a Biotek Synergy 2 plate reader using default settings. For the time course assay, the cells were incubated at medium shaking speed in a Biotek Synergy 2.

Screening of Known 5-HTR4 Agonists. The same protocol for serotonin detection was followed. Instead of 2  $\mu$ L of serotonin the same volume of RS67333, zacopride, and metoclopramide in water or cisapride, mosapride, tegaserod, and prucalopride in DMSO were used to reach a final concentrations between 0 and 10 000 nM. Dose response curves were fitted using the dose–response equation in Origin Pro 2016. EC<sub>50</sub>s were derived from this function by Origin.

High-Throughput Chemical Compound Screening. High-Throughput Assay Validation. A three-day assay validation was performed according to Iversen, *et al.*<sup>20</sup> The same serotonin detection protocol was followed. High signal wells have 5  $\mu$ M of serotonin, mid signal wells have 60 nM of serotonin, and low signal wells have 0 nM of serotonin. Data were analyzed in the Excel template provided by Iversen, *et al.*<sup>20</sup> using activation assay settings with statistics calculated for single replicate screens.

Chemical Compound Screening. The same protocol used for serotonin detection was followed. Instead of 2  $\mu$ L of serotonin, and 2  $\mu$ L of chemical in DMSO or water from the natural product library (Selleck Chemicals L1400, 803 chemicals) or the anti-infection compound library (Selleck Chemicals L3100, 403 chemicals) was used to a final concentration of 10  $\mu$ M (and 1  $\mu$ M in the case of the antiinfection library). Each plate contained three negative control wells with DMSO or water and three positive controls with serotonin (5  $\mu$ M) in DMSO. Natural product hits were identified using a Z-score as calculated below. The Z-scores were normalized to the serotonin positive control in each 96well plates.

$$Z\text{-score} = \frac{\text{natural product} - \text{mean DMSO}}{\text{STDev DMSO}}$$

**Principal Component Analysis.** *Data Gathering.* Simplified molecular-input line-entry system (SMILES) for 801 of the 803 chemicals in the natural product library (lanolin and tea polyphenols are mixtures) were retrieved from Selleck Chemicals and PubChem to obtain data on 23 chemical descriptors with 8 descriptors representing chemical functional groups, and 15 descriptors according to Wenderski, *et al.*<sup>46</sup> The SMILES were inputted into Instant JChem (ChemAxon).

Data Analysis. PCA was run using Solo software (Eigenvector Research). Evaluation of the three PCs was conducted using Solo based on Eigenvalues. The three PC scores data from Solo were used to create 3-D scatterplots in MATLAB. The scatterplots were divided into eight distinct chemical spaces based on their 3-D coordinates.

**Colon Cell Wound Healing Assay.** Caco-2 cells (ATCC HTB-37) were grown at 37 °C with 5%  $CO_2$  in Dulbecco's Modified Eagle Medium (DMEM) with high glucose, sodium pyruvate and GlutaMAX or L-glutamine (Gibco) supplemented with 10% fetal bovine serum and 1% penicillin-streptomycin. Media was changed every 2–3 days. Once 70–80% confluence was reached in T25 flasks, cells were detached using 0.05% trypsin–EDTA and diluted to a final volume of 15 mL with growth media. Cells were seeded into a 48 well plate and allowed to grow until they reached 90–100% confluence.

Wounds were made with a P200 pipet tip and cells were washed with PBS. Cells were incubated in fresh growth media with either PBS, 10  $\mu$ M of chemical hit or 1  $\mu$ M of serotonin or tegaserod. Images were taken on a Leica inverted microscope at 0, 24, and 48 h. ImageJ MRI Wound Healing Tool [http://dev.mri.cnrs.fr/projects/imagej-macros/wiki/Wound\_Healing\_Tool] was used to measure wound size.

**Cell Migration Assay.** Caco-2 cells were maintained as stated above. Ibidi culture inserts were placed in a 24 well plate, and 70  $\mu$ L of cells ((1–2) × 10<sup>5</sup> cells/mL) were placed in both insert wells. Cells were grown overnight to allow for attachment. Inserts were removed with sterile tweezers. Cells were washed twice with PBS then incubated with either PBS, 10  $\mu$ M of chemical hit or serotonin, or 1  $\mu$ M of tegaserod. Images were taken on a Leica inverted microscope at 0, 24, and 48 h. ImageJ MRI Wound Healing Tool was used to measure the cell free zone.

# ASSOCIATED CONTENT

#### **S** Supporting Information

The Supporting Information is available free of charge on the ACS Publications website at DOI: 10.1021/acssynbio.9b00310.

Materials and methods; Sequences; Table S1: Table of plasmids; Table S2: Table of primers; Table S3: Table of strains; Table S4: Table of chemicals descriptors used in the PCA analysis; Table S5: Table of chemicals space composition of the natural product library; Figure S1: Three-day 96-well plate validation assay; Figure S2: Dose response curves of the 6 natural product hits that could not be confirmed; Figure S3: Dose response curves of the 4 anti-infection hits that could not be confirmed; Figure S5: Photomicrographs of colon cell migration assay after 0, 24, and 48 h; Figure S5: Photomicrographs of colon cell scratch wound healing assay after 0, 24, and 48 h. (PDF)

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## **Author Contributions**

E.A.Y. and P.P.-Y. conceived the assay, designed the experiments, and wrote the manuscript. E.A.Y. and A.A.A. carried out the experiments. W.S. carried out the principal component analysis. All authors approved the manuscript.

## Notes

The authors declare no competing financial interest.

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