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1	Pattern formation and bistability in a synthetic intercellular genetic toggle
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12	
13	Summary
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15	Differentiation within multicellular organisms is a complex process that helps to establish spatial
16	patterning and tissue formation within the body. Often, the differentiation of cells is governed by
17	morphogens and intercellular signaling molecules that guide the fate of each cell, frequently
18	using toggle-like regulatory components. Synthetic biologists have long sought to recapitulate
19	patterned differentiation with engineered cellular communities and various methods for
20	differentiating bacteria have been invented. Here, we couple a synthetic co-repressive toggle
21	switch with intercellular signaling pathways to create a "quorum-sensing toggle." We show that
22	this circuit not only exhibits population-wide bistability in a well-mixed liquid environment, but
23	also generates patterns of differentiation in colonies grown on agar containing an externally
24	supplied morphogen. If coupled to other metabolic processes, circuits such as the one
25	described here would allow for the engineering of spatially patterned, differentiated bacteria for
26	use in biomaterials and bioelectronics.
27	
28	Keywords
29	Genetic toggle switch, quorum sensing, pattern formation, self-organization, synthetic biology.
30	
31	Introduction
32	One goal of synthetic biology is the creation of engineered biological systems that can perform a
33	wide variety of functions (Benner & Sismour, 2005; Cameron et al., 2014; Cheng & Lu, 2012;

- 34 Church et al., 2014). Such systems could be used for various environmental, industrial, and

medical applications (Callura et al., 2012; Khalil & Collins, 2010; McCarty & Ledesma-Amaro,
2019; Xia et al., 2019). However, synthetic biology is also advancing basic research by
providing a bottom-up approach to understanding phenomena governed by nontrivial genetic
regulatory mechanisms. This is done by creating and perturbing "synthetic gene circuits" in
living systems that behave similarly to their natural counterparts and can thus serve as a model
systems (Davies & Glykofrydis, 2020; Weisenberger & Deans, 2018).

41 As part of the ground up approach to basic research, synthetic biologists have long 42 sought to use engineered cells to recapitulate spatial patterns seen in multicellular systems 43 (Cachat et al., 2017; Davies & Glykofrydis, 2020; Grant et al., 2020; Kim et al., 2020; Santos-44 Moreno & Schaerli, 2018; Sekine et al., 2018). Many mechanisms have been proposed to explain the appearance of natural patterning, such as the reaction-diffusion model (Turing, 45 46 1952) and the positional information model (or French flag model) (Wolpert, 1969). These 47 mechanisms have been used as blueprints for synthetic analogs of biological patterns (Diambra 48 et al., 2015; Karig et al., 2018a; Sekine et al., 2018). Scientists are also working towards self-49 organizing patterns (Cachat et al., 2017; Cao et al., 2016; Curatolo et al., 2020; Liu et al., 2011; 50 Payne et al., 2013; Potvin-Trottier et al., 2016; Santos-Moreno & Schaerli, 2018) that use 51 intercellular signals to regulate transcriptional activity (Cao et al., 2016; Curatolo et al., 2020; Liu 52 et al., 2011; Payne et al., 2013).

53 Indeed, the circuit topology of the first synthetic gene circuit to be described, the "genetic 54 toggle switch" (Gardner et al., 2000a), has also been implicated in spatial patterning. The toggle 55 switch is comprised of just two repressors that regulate each other's promoters - and it 56 therefore has two possible transcriptional states corresponding to one active repressor gene, 57 and the other repressed. Gene networks akin to the toggle switch are thought to help stabilize 58 and refine spatial boundaries within differentiated populations because the two expression 59 states of the toggle are generally mutually exclusive (Briscoe & Small, 2015). Toggle-like 60 regulatory components are found throughout developmental processes, such as in the anterior-61 posterior development of the Drosophila blastoderm (Nasiadka et al., 2002; Struhl, 1989), and in 62 the dorsal-ventral development of the vertebrate neural tube (Alaynick et al., 2011; Dessaud et 63 al., 2008).

In multicellular systems, toggle switches can function independently. In the absence of
any external signal (e.g., morphogens), the internal stochastic dynamics and bias of each cell
determine the transcriptional states of the respective toggle switches. In other words, each cell
randomly assumes one of the two states. However, in the presence of an external morphogen
gradient, a distinct boundary is formed between cells in the two different transcriptional states.

2

69 This can occur if the toggle switch exhibits hysteresis (bistability) as a function of the

70 morphogen.

71 Here, we built a version of the genetic toggle switch in *Escherichia coli* that uses 72 intercellular signaling to reinforce each transcriptional state. For instance, if a cell is in the "ON" 73 state it produces an intercellular signal that up-regulates the ON state in nearby cells. The 74 addition of intercellular signaling to the toggle has been proposed as a means of creating a 75 population-level toggle switch, allowing all cells in the population to simultaneously reside in one 76 of the two possible transcriptional states (Nikolaev & Sontag, 2016). We experimentally confirm 77 that, given the right conditions, this version of the toggle does exhibit population-level bistability 78 in a well-mixed liquid culture. Additionally, we show that when grown on solid agar imbued with 79 an exogenous morphogen, colonies of these cells form three dimensional patterns that are 80 distinctly different from those observed in colonies of cells containing a traditional toggle switch 81 lacking intercellular signaling. In particular, the addition of intercellular signaling creates a 82 regime that enables a shift in the resulting pattern. We develop a mechanistic mathematical 83 model of the system, to explain how degradation, diffusion, and sequestration of the signaling 84 molecules and inducers determine the observed patterns.

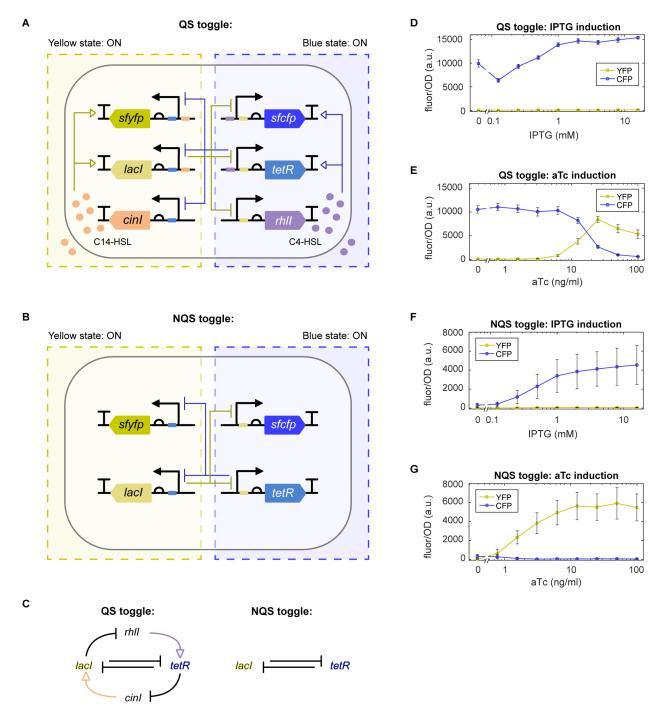
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86 <u>Results</u>

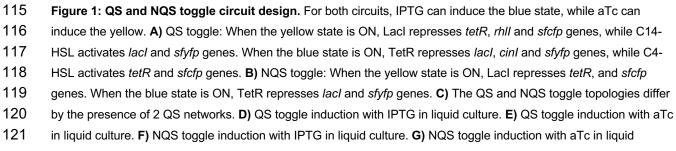
87 General characteristics of QS and NQS toggles

88 Here, we call the version of the toggle switch that includes intercellular signaling the "QS 89 toggle", as it uses refactored **q**uorum **s**ensing pathways to generate intercellular signals. The 90 QS toggle is a version of the genetic toggle switch (Gardner et al., 2000a) that includes two 91 repressors that repress each other's promoters (Lacl and TetR). Additionally, it includes a 92 reporter for each state (YFP and CFP). The circuit also includes two orthogonal QS pathways 93 (CinR/I and RhIR/I) (Chen et al., 2015; Lithgow et al., 2000; Pesci et al., 1997) to produce the 94 necessary intercellular signaling. A representation of the QS toggle's two fluorescent states is 95 shown in Fig. 1A. For the yellow state to be active (Fig. 1A, left), Lacl represses the promoters 96 driving the expression of tetR, cfp and rhll. With tetR repressed, cinl is expressed, and its 97 protein catalyzes the production of C14-HSL. When bound to the CinR transcription factor, C14-98 HSL activates the expression of *lacl* and *vfp*. Alternatively, for the blue state to be active (Fig. 99 1A, right), TetR represses the promoters driving the expression of *lacl*, *yfp* and *cinl*. With *lacl* 100 repressed, *rhll* is expressed, and its protein produces C4-HSL. When bound to the RhIR 101 transcription factor, C4-HSL activates the expression of *tetR* and *cfp*. One can exogenously 102 induce the yellow state by adding anhydrotetracycline (aTc), which will inactivate TetR (Fig. 1E). Similarly, one can exogenously induce the blue state by adding isopropyl- β -D-1-

- 104 thiogalactopyranoside (IPTG), inactivating Lacl (Fig. 1D). The QS toggle is unbalanced in the
- absence of inducers: it exhibited a preference to the blue state (Fig. 1D, E). We also found that
- this imbalance is dependent on the QS network (Fig. S2I, J). The interaction of the main circuit
- 107 elements is summarized in Fig. 1C. The QS toggle topology (Fig. 1C, left) differs from the
- 108 conventional (non-quorum sensing toggle or "NQS toggle"- Fig. 1C, right) topology by the
- 109 presence of two QS networks, creating extra positive feedback loops. The NQS circuit includes
- 110 the same repressors and reporter genes but driven by promoters that are only responsive to
- 111 these repressors (Fig. 1B). The NQS toggle can also be tuned with IPTG and aTc (Fig. 1F and
- 112 1G). For all experiments, we transformed the plasmid-borne QS and NQS circuits into *E. coli*
- 113 cells that contained constitutively expressed *cinR* and *rhIR* in their genome.





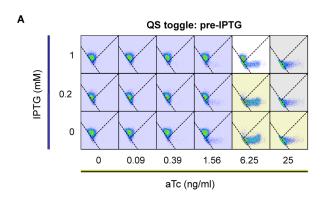


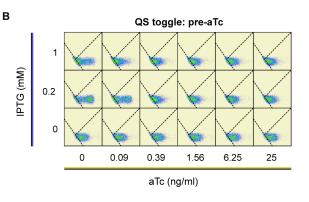
122 culture. Lines represent the average fluorescence and error bars represent the standard deviation of 3 technical123 replicates for 3 independent experiments.

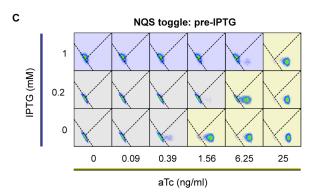
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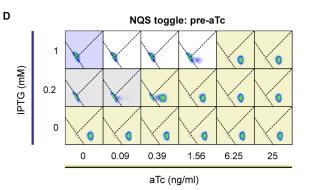
125 We first checked whether cells containing the QS toggle exhibited population-level 126 bistability. Genetic toggles are often bistable (Barbier et al., 2020; Gardner et al., 2000a; 127 Lugagne et al., 2017: Wang et al., 2009), *i.e.* they can stably reside in either of two possible 128 transcriptional states. To find the bistable region for both the QS and NQS toggles, we grew 129 overnight cultures with either IPTG or aTc to allow for the populations to start in either state 130 (blue or yellow, respectively). We then grew these cells in liquid culture using various 131 combinations of IPTG and aTc concentrations and used flow cytometry to measure the CFP and 132 YFP fluorescence of individual cells. After three hours, we observed that, when starting in the 133 yellow state (*i.e.* previously grown in media with aTc), QS toggle cells all remained in the yellow 134 state for all combinations of inducer (Fig. 2A, right). However, when starting in the blue state 135 (i.e., previously grown in media with IPTG), QS toggle populations shifted to the yellow state at 136 sufficiently high aTc but remained in the blue state at lower concentrations (Fig. 2A, left). 137 Importantly, we observed cultures in which all cells were either in the blue or yellow state 138 depending on the starting condition and the inducer concentration (Fig. 2A) – indicating that the 139 QS toggle is bistable at the population level in those conditions. Meanwhile, NQS toggle cells 140 transitioned to blue and yellow, when starting from the opposite color initial conditions (Fig. 2B). 141 We also observed that cells pre-induced with IPTG primarily did not show any fluorescence (Fig. 142 2B, left), although the blue state was inducible. A third state (OFF), in which cells exhibited little 143 to no fluorescence of either type, was more common within NQS cells. The NQS toggle was 144 also bistable for some conditions. When growing the cells for 9 hours instead, the NQS toggle 145 showed a decrease in both intensities in all tested conditions, while the QS toggle tended to 146 show stronger fluorescence intensities (Fig. S1).

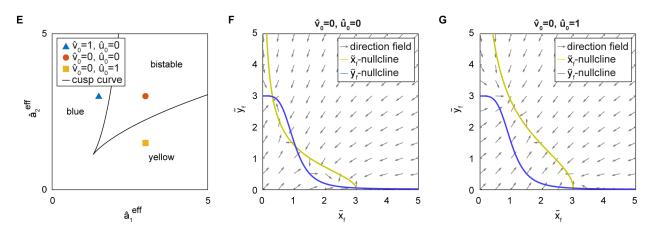
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149 Figure 2: Behavior of QS and NQS toggle cells when treated with a combination of inducers. A-B) Flow 150 cytometry data of QS toggle cells that were pre-induced with either IPTG (A) or aTc (B). Each dot is a single cell 151 classified within a gate. Gates were determined with single color and double negative controls. Dashed lines in each 152 plot represent the boundaries between the three distinct gates, which represent cellular states: CFP+ (top gate), 153 YFP+ (bottom-right gate), and OFF (bottom-left gate). Background colors in each plot represent which state the 154 majority of cells are in (>50%): blue color indicates mostly CFP+ cells, yellow plots are mostly YFP+, gray plots are 155 mostly OFF, and white plots indicate cells that are present in multiple states (<50% each). C, D) Flow cytometry data 156 of NQS toggle cells that were pre-induced with either IPTG (C) or aTc (D). E) Bifurcation diagram of the QS toggle 157 system over the nondimensionalized parameters \hat{a}_1^{eff} and \hat{a}_2^{eff} , the effective promoter strength of the repressors. Here 158 we demonstrate a case where without exogenous inducers, aTc or IPTG, the system is bistable (red dot). Adding aTc

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or IPTG (blue triangle and yellow square respectively), lowers the effective promoter strength, which can in turn lead
 to changes in the state of the cell to be monostable in either the blue or yellow state. F, G) Phase portrait of the QS
 toggle system for chosen parameter values denoted by the red dot and blue triangle in E. Variable and parameters in
 E-G are nondimensionalized (see STAR methods).

163

164 We next developed a mathematical model of the toggle switches to understand under 165 what conditions the two versions of the circuit can exhibit bistability. Denoting by x(t) and y(t)166 the concentration of LacI and TetR, respectively, and by g(t) and h(t) the intracellular 167 concentration of QS signals, C14-HSL and C4-HSL, the model takes the form

168

$$\dot{x} = a_1 \eta_1(y) \phi_1(g) - (\gamma_1 + \gamma_d) x; \tag{1a}$$

 $\dot{\gamma} = a_2 \eta_2(x) \phi_2(h) - (\gamma_2 + \gamma_d) x,$ (1b)

where the parameter a_i determines the maximal production rates, γ_i the individual degradation rates for Lacl and TetR (numbered i = 1,2, respectively), and γ_d the rate of dilution due to cell growth. We model repression and activation of the promoters using Hill functions, η_i and ϕ_i , respectively. The intracellular concentration of QS signals obeys similar equations (See STAR methods for the full model).

We nondimensionalized Eq. (1) and performed a bifurcation analysis (see STAR methods), to first confirm the existence of the region of bistability in the QS toggle system model (See Fig. 2E). Moreover, as is evident in the production term of Lacl and TetR in Eq. (1), the preferred state of the QS toggle is not determined only by the presence of the QS signals, but also the relative promoter strength. This is characterized by the following nondimensionalized variables,

186

$$\tilde{a}_1 = \frac{a_1 \theta_x}{\gamma_1 + \gamma_d} \text{ and } \tilde{a}_2 = \frac{a_2 \theta_y}{\gamma_2 + \gamma_d},$$
(2)

181 where θ_x and θ_y are the repression thresholds for LacI and TetR, respectively, used in the Hill 182 functions, η_i . When exogenous inducers, aTc or IPTG, are added to the system, the relative 183 promoter strength is modified. Following experiments, we assumed that these inducers are 184 provided at some constant level, denoted by nondimensionalized parameter \hat{v}_0 and \hat{u}_0 . This 185 leads to the following effective promoter strengths,

187
$$\hat{a}_{1}^{\text{eff}} = \frac{\tilde{a}_{1}}{1 + \hat{v}_{0}} \frac{\tilde{g}^{*}}{1 + \tilde{g}^{*}}, \qquad \hat{a}_{2}^{\text{eff}} = \frac{\tilde{a}_{2}}{1 + \hat{u}_{0}} \frac{\tilde{h}^{*}}{1 + \tilde{h}^{*}}, \tag{3}$$

with \tilde{g}^* and \tilde{h}^* representing the nondimensionalized C14 and C4 concentrations in the system. Depending on the values of the bifurcation parameters $(\hat{a}_1^{\text{eff}}, \hat{a}_2^{\text{eff}})$ the system can be either mono- or bistable (see Fig. 2E-G; STAR methods for the full model). 191 The mathematical model thus predicted that bistability depends on the QS network and 192 relative promoter strengths. We tested this prediction experimentally by engineering a few 193 variants of the QS toggle that changed those factors (see SI). These variants exhibited changes

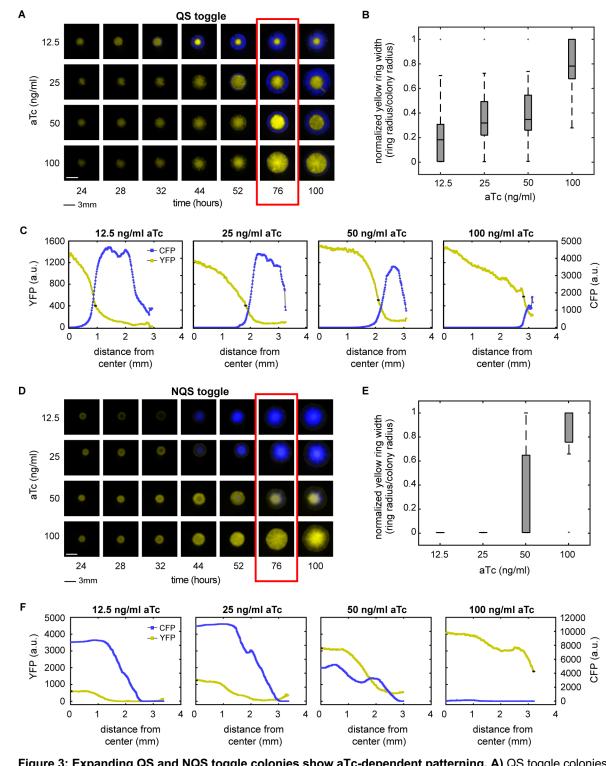
in state preference, agreeing with the prediction of the model (Fig. S2).

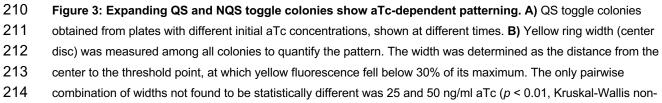
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196 QS and NQS toggle behavior in colonies

We next asked how the QS toggle behaves in an environment in which the QS signals are not
homogeneously distributed in the population, allowing for spatial patterns to arise. To do this,
we grew QS and NQS toggle colonies in LB agar plates containing aTc and monitored their
growth and fluorescence over time.

201 Most strikingly, we noticed that many QS toggle colonies formed a blue ring surrounding 202 a yellow disc (Fig. 3A), with the size of the yellow disc correlated with the aTc concentration in 203 the agar (Fig. 3B). ATc is known to be temperature sensitive (Politi et al., 2014). Since aTc 204 induces the expression of the yellow state, we hypothesized that aTc degradation was driving 205 the emergence of blue cells. Indeed, we verified that prior incubation of aTc plates at 37°C 206 directly alters the blue ring size and time of appearance (Fig. S3). Thus, the decay of aTc 207 creates a temporal morphogen gradient, resulting in a switch in the state of some of the 208 population.





215 parametric test). Data represents at least 11 independent experiments. C) Fluorescence intensity cross-sectionals of 216 the colonies shown in red in (A). Curves represent the average fluorescence of 4 radii (90° apart) of the same colony. 217 D) NQS toggle colonies obtained from plates with different initial aTc concentrations, shown at different times. E) 218 Yellow ring width was used to quantify the patterns as in (B). We considered yellow ring width to be zero when blue 219 cells dominate the center (see methods for full set of assumptions). All pairwise that included 100 ng/ml aTc were 220 found to be statistically different (*p < 0.01, Kruskal-Wallis non-parametric test). Data represents 2 independent 221 experiments. F) Fluorescence intensity cross-sectionals of colonies shown in red in (C). Curves represent the 222 average fluorescence of 4 radii of the same colony.

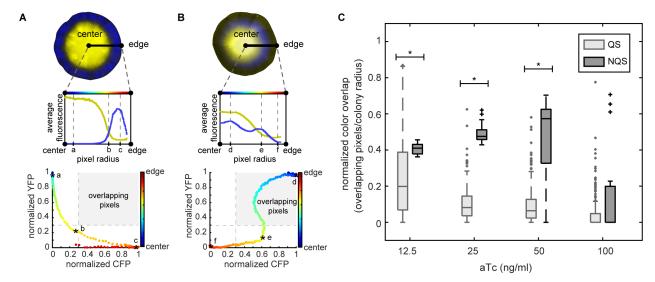
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In the images of QS toggle colonies, we observed little overlap between cells in the yellow and blue states (Fig. 3C). Over time, the blue ring generally expanded as the colony grew, but the boundary between the yellow and blue cells remained roughly fixed. Wherever cells in the blue state took over, yellow fluorescence tended to decrease.

When grown on solid media, the NQS toggle behaved differently from the QS toggle. Like the QS toggle, NQS toggle colonies were initially yellow when the media contained a high enough concentration of aTc. Cells in the blue state emerged eventually but did so in a way distinct from what we observed in the QS toggle: Blue cells first appeared in colony centers, and did so earlier and at lower aTc concentrations (Fig. 3D). Most NQS toggle colonies grown with 12.5-50 ng/ml aTc showed blue cells in the center at 76h (Fig. 3E), which resulted in yellow region width measurements close to zero (see Methods).

235 One of the main differences in spatial patterns between the two toggles was the degree 236 of radial separation between the states. The QS toggle colonies appeared to segregate well in 237 contrast to the NQS togale colonies (Fig. 3F). To guantify the level of segregation, we measured 238 the pixel color overlap in images from both QS and NQS colonies: For each pixel, we measured 239 the intensity of both blue and yellow fluorescence and in Fig. 4A and B (bottom panels), we 240 show the normalized YFP and CFP fluorescence as a function of distance from the center of the 241 colony. We said that colors overlapped in a pixel when the values of both YFP and CFP 242 fluorescence intensities were each above a threshold of 0.3 (out of a maximum intensity 243 normalized to 1). To obtain the relative overlap count for a colony, we divided the number of 244 overlapping pixels by the total number of pixels covering the colony radius (See Fig. 4C).

Color overlap was significantly higher in the NQS compared to QS colonies in 12.5, 25, and 50 ng/ml aTc plates (p < 0.01, Mann-Whitney non-parametric test). In 100 ng/ml aTc plates, we observed little overlap with both circuits, mostly because not all colonies contained cells in the blue state. When we excluded from analysis colonies with cells in only one state, NQS colonies displayed higher overlap than QS colonies at all aTc concentrations (Fig. S4).



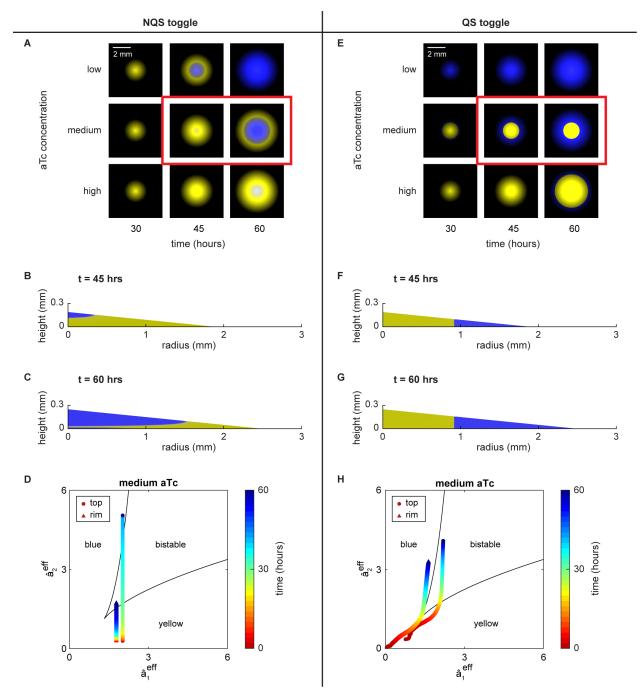
251 Figure 4: QS colonies create better radially separated patterns than NQS colonies. Measurement of color 252 overlap was used to quantify the spatial segregation of states in each colony. Average fluorescence of each colony's 253 radii plotted from the center of the colony to the edge (A and B, top plots). Each pixel was also plotted for both 254 normalized fluorescence values (A and B, bottom dot plots). Pixels were classified as overlapping when both 255 normalized fluorescence values were above a predefined threshold (inside the gray boxed region). A) Example of the 256 typical behavior of QS colonies. The QS colony shown is the same as that in Fig. 3A, at 50 ng/ml and 76 hours. 257 Asterisks (a, b, c) show the same pixels in both plots. B) Example for the typical behavior in NQS colonies. NQS 258 colony shown is from Fig. 3C, 50 ng/ml at 76 hours. Asterisks (d, e, f) show the same pixels in both plots. C) 259 Quantification of pixel overlap for QS (light gray) and NQS (dark gray) colonies. The number of overlapping pixels 260 was normalized by the colony radius (total). *p < 0.01. Mann-Whitney non-parametric test. Data for each QS test 261 contains over 180 colonies from at least 11 independent experiments, while data for each NQS test contains at least 262 15 colonies from 2 independent experiments.

263

250

264 Lower overlap indicates a better separation of colors, and hence a better spatial 265 separation of cells in the two states along the radial direction of a colony. Therefore, QS cells in 266 different states were better segregated radially than NQS cells. However, since we imaged the 267 colony from above, the higher degree of overlap in the NQS case could indicate either that cells 268 in the two states are intermingled, or that they are segregated vertically. To test which of these 269 hypotheses is more likely, we extended our mathematical models to include spatial effects, such 270 as colony growth, and the diffusion of inducers and signaling molecules within the agar and the 271 colony. We assumed that the colony is conical and grows through the addition of cells in an 272 active growing zone at the interface of the colony with agar (Warren et al., 2019) (see STAR 273 methods).

274 Simulations of our expanded models recapitulated experimental observations, and 275 suggested answers to our questions about the observed segregation of cells in different states. 276 In the simulations of the NQS togole colony (Movie S1), with smaller colony sizes and abundant 277 aTc supply from the agar, aTc levels are relatively high everywhere in the NQS toggle colony. 278 This explains the initial colony-wide yellow state we observed in experiments (Fig. 3D). In this 279 initial yellow state, intracellular concentration of TetR is low, leading to a low sequestration rate 280 of aTc inside the colony. The top of the colony is further from the aTc source (agar), so that a 281 top-down aTc gradient forms over time. As the model colony grows, we observe an increase in 282 sequestration and degradation of aTc (due to 37°C incubation over time). Eventually, the aTc 283 level at the top of the colony, where concentration is lowest, degrades below the point needed 284 to keep cells in the yellow state, causing the top of the colony to turn blue. Cells entering the 285 blue state produce more TetR, which enables higher aTc sequestration, further lowering 286 surrounding aTc levels. As a result, we observed a blue wave traveling downwards from the top 287 of the colony. Thus, our model predicted that the two states are vertically segregated in NQS 288 colonies, suggesting that spatial segregation, rather than heterogeneity, is responsible for the 289 experimentally observed color overlap. We also examined the state of the system by tracking 290 the bifurcation parameters (Eq. 3) at the center (top) and the periphery (rim) of the NQS colony 291 over time (Fig. 5D). In simulations, the top of the colony moves from the bistable state into the 292 blue state, while the rim of the colony remains in the yellow state (Fig. 5B, C). Our simulations 293 and bifurcation analysis also revealed that at higher initial aTc concentrations the blue state 294 takes over from the top at a later time (Fig. 5A), as it takes longer for aTc to degrade to the 295 hysteresis point at which cells can switch states.





297 Figure 5: PDE simulations of NQS and QS toggles. A) Simulations of the NQS colony at different times and initial 298 aTc concentration show the emergence of cells in the blue cells at the center of the colony. B) The cross-sectional view 299 of the model colonies shows that cells enter the blue state first at the top of the colony, and that cells in the two states 300 remain vertically segregated. C) Bifurcation diagram showing the bifurcation parameters' trajectories of cells at the top 301 (circle) and rim (triangle) of the NQS colony. The top of the colony flips from yellow to blue. D) Simulations of a model 302 QS colony show that a blue ring emerges dependent on the initial aTc concentration. E) The cross-sectional view of 303 the model colonies shows that the cells in the two states are radially segregated, and that the boundary between the 304 two states is roughly fixed, in agreement with experiments. F) Same as in C), but showing that in the QS colony the rim 305 of the colony flips from the yellow to blue state.

306

307 In simulated QS toggle colonies (Movie S2), when the colony is small, abundant aTc and 308 basal C14-HSL production led to the establishment of the initial yellow state across the colony. 309 This state was then reinforced by the high C14-HSL signal. As indicated by Eq. 2, the dilution 310 rate alters the effective promoter strength, leading to different steady states. Cells that are not 311 growing or growing slowly, such as those at the top of the colony, stay in the bistable region, 312 and do not switch states (Fig. 5H). This explains why the center of the colony remains yellow, 313 despite reduced aTc levels due to degradation and seguestration. In contrast, for fast-growing 314 cells, the drop in aTc concentration and the slow accumulation of C4-HSL signal from basal 315 production allow cells to enter the blue state (Fig. 5F). Cells in the blue state start to appear at 316 the periphery of the colony, where cells grow fastest (Movie S2). This explains why in the QS 317 toggle color overlap is small (vertical slices are in the same state), and the boundary between 318 the yellow and blue states is maintained at the point where the first cells turn blue (Fig. 5F, G), 319 in agreement with experimental observations (Fig. 3A). Like the NQS toggle, higher aTc 320 concentrations lead to the blue ring emerging later in time (Fig. 5E).

321 To verify the predictions of the model about the different spatial structures in QS and 322 NQS colonies, we used confocal microscopy to image the 3D structures of the colonies (Fig. 6). 323 For the NQS toggle, we observed that the colonies indeed showed vertical segregation, with 324 cells at the top of the colony dome in the blue, and cells at the bottom in the vellow state (Fig. 325 6C, F). We also sliced the colonies vertically and imaged their cross-sections using confocal 326 microscopy (see Methods). The slices confirmed that cells in the blue state occupied the top of 327 NQS colonies, while cells in the yellow state occupied the bottom, as predicted by the model 328 (Fig. 6F). In contrast, confocal images of QS toggle colonies displayed radial separation 329 between the states, again confirming the predictions of the model, and in agreement with our 330 earlier analysis of experimental findings (Fig. 6A, E). Depending on the aTc concentration, the 331 QS toggle cells at the top of the colony remained yellow, and blue cells only appeared in the 332 outer part of the colony. Imaging of colony slices also confirmed this observation (Fig. 6E).

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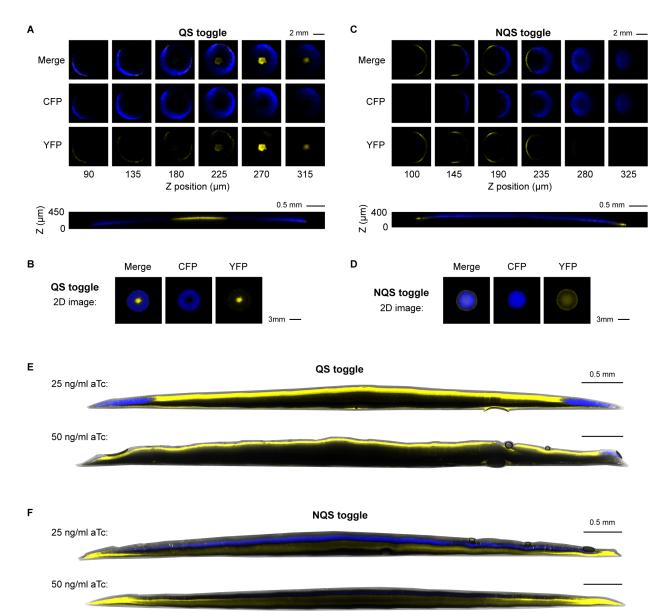
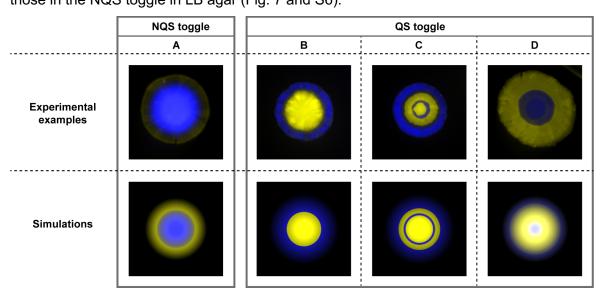




Figure 6: Three-dimensional view of QS and NQS colonies. A) QS toggle layers from top to bottom of colony (left to right). Orthogonal view of the QS toggle frames is shown below. Colony is not more than 250 µm tall. B) 2D image of the same colony in (A) for comparison. Separate fluorescence channels are shown. C) NQS toggle layers from top to bottom of colony (left to right). Orthogonal view of the NQS toggle frames is shown below. D) 2D image of the same colony in (C) for comparison. Separate fluorescence channels are shown. E) Slices of different QS colonies grown in either 25 or 50 ng/ml aTc. F) Slices of different NQS colonies grown in either 25 or 50 ng/ml aTc.

340

We found that ring formation in the QS toggle exhibited some variability and randomness causing imperfect radial symmetry of the outer blue rings. Despite this variability, the difference in color segregation between QS and NQS colonies was statistically significant (see Fig. 4). Occasionally, we also observed the occurrence of multiple blue rings: *i.e.* the formation of internal and external blue rings in QS toggle colonies (Fig. 7 and S5). In addition, patches of 346 blue cells sometimes failed to form a full ring (Fig. S5). These observations suggested that 347 external or internal fluctuations could play a role in determining the observed spatial patterns. 348 Noise can cause jumps between the stable states of a bistable system. However, we expect 349 such switches to be localized in the absence of a mechanism that can synchronize the state 350 across the colony. Thus, we concluded that external fluctuations that affect all or most of the 351 colony were more likely to drive the emergence of complex spatial patterns such as multiple 352 rings. Furthermore, when the QS toggle was grown in a different medium (EZ rich defined 353 medium instead of LB agar), the outer blue ring pattern was disrupted. At times, we observed 354 blue cells emerging from the center of the colony at 100 ng/ml aTc. These patterns resembled 355 those in the NQS toggle in LB agar (Fig. 7 and S6).



356

Figure 7: Four types of patterns obtained from experiments (top) and mathematical simulations (bottom). A)
NQS toggle colony pattern, with vertical segregation of states and blue emergence at the center of the colony. B) QS
toggle colony pattern, with radial segregation of states, and blue emergence at the edge of the colony, forming an
external blue ring. C) Alternative QS toggle pattern, with radial segregation of states and blue emergence at the emergence at the center of the colony forming an
and external). D) Inverted QS toggle pattern, where radial segregation of states and blue emergence at the center
occur only in specific conditions (see SI).

363

We were able to obtain similar patterns in numerical simulations by changing parameter values, or by including extrinsic perturbations in the model we described above (Fig. 7 and STAR methods). In particular, we found that extrinsic fluctuations and growth conditions can change effective promoter strength, resulting in the formation of multiple rings and an inverted pattern in the QS system, respectively. This suggests that the complex spatial patterns we observed in some experiments can be explained using the same mechanisms underlying the predominant, single ring patterns. The variability of multi-ring patterns, along with the high 371 dimensionality of the model parameter space makes it difficult to examine such patterns

372 systematically. A full understanding of how these complex patterns emerge, and how they can

373 be controlled will thus require the development of new experimental approaches.

374

375 Discussion

376 Patterns, and especially ring-like patterns, formed by synthetic gene circuits are not new. 377 Previous studies have utilized various methods to create patterns, such as internal genetic 378 oscillations (Riglar et al., 2019), scale-invariant intracellular signaling (Cao et al., 2016), or 379 mechanical interactions between cell types (Xiong et al., 2020). Here we show that toggle 380 switches can also create patterns in colonies based on how they shape the cells' responses to a 381 morphogen. Specifically, the classical NQS toggle creates a vertically segregated pattern while 382 the QS toggle leads to a segregated ring structure. We also developed a PDE model that 383 captured both behaviors. An analysis of the model suggests that in the NQS case sequestration 384 of signals and geometry of the colony lead to the formation of a morphogen gradient inside the 385 colony, creating top-down segregation. In contrast, the model suggests that fast cell growth at 386 the periphery of QS toggle colonies and the QS signal gradient inside the colonies lead to the 387 emergence of an outer blue ring. The difference is that, as the aTc level decreases in the QS 388 toggle, signaling between cells in the yellow core helps to lock them in the same state. 389 However, in the NQS toggle, the blue state becomes monostable in the absence of aTc and 390 signals from other cells. As the aTc concentration is lowest at the top of the colony, a wave of 391 transitions from the yellow to the blue state propagates from the colony's top downward. Our 392 mathematical analysis implies bistability is determined by the external morphogen concentration 393 and the effective promoter strength for each repressor, which is, in turn, determined by protein 394 production, proteolytic degradation, dilution, and QS signals.

395 Our mathematical model provides further insight into the mechanisms behind the 396 formation of patterns. When modeling pattern formation on the time scale of hours, one must 397 account for expanding colony size. As suggested by Warren et al. (2019), an actively growing 398 layer at the bottom of the colony drives the 'establishment phase' (14h - 24h). After 24 hours, 399 the colony enters a 'flattening phase', during which vertical growth slows while radial growth 400 remains linear. In our model, the characteristic length scale of signal diffusion is much larger 401 than the size of a colony, and thus details of the colony expansion mechanisms do not have a 402 large impact. We thus assumed that model colonies grow linearly in both vertical and radial 403 directions. The location of newly born cells, on the other hand, does matter. As new cells inherit the state of their parent cells, where the effective promoter strengths of the newly born cells landin the bistable region determines the emergent patterns in the colony.

406 It should be noted that our model does not precisely predict the full behaviors of the 407 colonies. Our experiments showed that fluorescence intensities were lower in the bulk of many 408 colonies and higher nearer the surface (Fig. 6E). This indicates that the colonies are more 409 complex than our model suggests. Yet, our model still provides gualitative insight into the 410 formation of the patterns and their symmetries. Further experimental studies on *E. coli* colony 411 growth, structure, and metabolism, especially at larger colony sizes, will allow for improvement 412 of the mathematical model and a better understanding of pattern formation in microbial colonies. 413 Our work indicates that the observed spatial patterns are dependent not just on the

414 underlying genetic circuitry, but also on growth conditions and cellular metabolism. Our 415 mathematical model allows us to identify which patterns are allowed by the system and the 416 mechanisms that generate them. The presence or absence of intercellular communication, for 417 instance, is not the determinant of a single pattern. Rather, the resultant pattern is determined 418 by multiple factors, including morphogen concentration, promoter strengths, and intercellular 419 signaling. Nevertheless, the presence of intercellular signaling allows one to actively control or 420 shape the balance by implementing more spatial features, such as signal degradation, by 421 differentiated cells or external flux. These patterns shed light into how synthetic multicellularity 422 can be created in bacteria and provide a further step toward the creation of large scale 423 programmable synthetic multicellular systems.

424

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436 Author contributions

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- 438 M.R.B; validation, B.F.M., M.R.B.; data curation, B.F.M.; investigation, B.F.M., G.F.; formal
- 439 analysis, B.F.M., G.F; visualization, B.F.M., G.F.; writing original draft, B.F.M., G.F., K.J.,
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- 443

444 **Declaration of interests**

- 445 The authors declare no competing interests.446
- 447 Main figure titles and legends
- 448 (In text)
- 449
- 450 STAR Methods

451 <u>Methods</u>

- 452 Plasmids and strains
- 453 We constructed plasmids with either PCR-based, restriction enzyme cloning, or Golden gate
- 454 assembly methods. QS and NQS toggles, as well as all other tested versions, are composed
- 455 with 3 plasmids each, providing resistance to kanamycin, chloramphenicol and spectinomycin. A
- 456 list of all plasmids employed is provided in Table S1. For this study, we used the CY027 *E. coli*
- 457 strain, a BW25113 derivative (Chen et al., 2015). This strain has the *lacl*, *araC* and *sdiA* genes
- 458 knocked out, and constitutive *cinR* and *rhIR* knocked-in to its genome to enable QS
- 459 communication ($\Delta lacl \Delta araC \Delta sdiA Ptrc^*-cinR Ptrc^*-rhIR$).
- 460

461 Plate reader experiments

From single colonies, we inoculated cells containing the appropriate plasmids into 5 mL LB with
antibiotics (50 μg/mL kanamycin, 34 μg/mL chloramphenicol, 50 μg/mL spectinomycin) for

- overnight growth at 37°C in a shaker (250 rpm). Then, we diluted the culture 1:100 in minimal
- 465 M9CA broth (Teknova) with antibiotics, and we grew these cells for 2 hours in a 37°C shaker
- 466 (250 rpm). Meanwhile, we prepared 96-well round bottom plates with minimal M9CA broth,
- 467 antibiotics, and applicable inducers (IPTG and aTc) with a 2-fold final concentration of a volume
- 468 of 100 μL per well. After the 2-hour growth, we added 100 μL of cell outgrowth to each well
- 469 (1:1). We incubated the plates at 37°C, shaking at 800 rpm. After 2 hours, we read each plate in
- 470 a Tecan Infinite M1000 for growth (OD, 600 nm), YFP fluorescence (ex, 514 nm; em, 527 nm),

471 and CFP fluorescence (ex, 433 nm; em, 475 nm). We used cells without plasmids to measure

- 472 background auto-fluorescence. The results shown are reported as (fluorescence-
- 473 background)/OD₆₀₀.
- 474

475 Flow cytometry

476 We inoculated cells from single colonies into 5 mL LB with antibiotics and either 0.5 mM IPTG 477 (pre-IPTG) or 50 ng/ml aTc (pre-aTc) for the overnight growth at 37°C in a shaker (250 rpm). 478 Next, we prepared 96-well round bottom plates with minimal M9CA broth, antibiotics, and 479 applicable inducers (IPTG and aTc) with a 2-fold final concentration at a volume of 100 µL per 480 well. We diluted the overnight cultures 1:50 in minimal M9CA broth with antibiotics, and we 481 added 100 µL of this cell dilution to each well (1:1, final cell dilution of 1:100). We incubated the 482 plates at 37°C, shaking at 650 rpm. After 3 hours (and 9 or 12 hours for stationary phase tests), 483 we kept the plates on ice for at least 10 min. Then, we added 25 μ L of each well to a tube with 475 μL of 1x PBS (5% dilution), and vortexed the tube. We analyzed each tube with the Sony 484 485 SH800S Cell Sorter. We used filters for mCFP and EYFP. Due to overlap in their fluorescence 486 spectra, we used single fluorescence controls and the Sony software calculated compensations 487 for each fluorophore. All CFP and YFP values shown here are compensated. For each sample, 488 we recorded 10,000 events. We exported and analyzed the acquired data with FlowJo. We 489 manually created the fluorescence gates. The common existence of OFF cells among the 490 circuits (i.e., cells that are expressing neither CFP nor YFP) generated the need for an OFF 491 gate. We created blank controls for each circuit by transforming the circuit plasmids with an 492 empty reporter plasmid instead of the regular CFP/YFP one. We used these circuits to 493 determine the OFF gate. Next, we created CFP+ and YFP+ gates by drawing a diagonal line 494 from top right to bottom left, until it reaches the OFF gate. CFP+ gate is at the upper left of this 495 line, while YFP+ is at the bottom right. We exported geometric mean values and population 496 composition based on these gates from FlowJo and plotted with Matlab. For the confocal tests, 497 we also used the Sony SH800S to sort single cells into small petri dishes (60 mm) containing LB 498 agar. We attached the dishes to the 96-well-plate stage for sorting, and later put them into 37°C 499 incubator for growth into single colonies.

500

501 Colony tests

502 We prepared LB agar plates with antibiotics (50 μ g/mL kanamycin, 34 μ g/mL chloramphenicol, 503 50 μ g/mL spectinomycin), and aTc (12.5, 25, 50 or 100 ng/ml). We inoculated cells from single 504 colonies into 5 mL LB with antibiotics and 0.0625 mM IPTG for overnight growth at 37°C in a 505 shaker (250 rpm). Next, we diluted the culture 1:100 in 4 mL LB with antibiotics and 0.0625 mM 506 IPTG, and we grew the culture at 37°C shaker (250 rpm) until it reached an OD₆₀₀ between 0.7-507 0.8 (approximately 2 hours). We then diluted the culture with LB to reach an OD_{600} range 508 between 0.35-0.4. Then, we used 1 mL of the diluted outgrowth for serial dilutions until we 509 achieved 1:10,000 and 1:100,000 (outgrowth:LB) ratios. We put plates to warm up in 37°C 510 incubator for at least an hour before plating. Then, we plated both 1:10,000 and 1:100,000 511 dilutions into 2 equal sets of plates, with 12 glass beads per plate. We wrapped plates in foil to 512 avoid light exposure of aTc, and we put them in a 37°C incubator. We took the plates at 24, 28, 513 32, 44, 52, 76 and 100h post-plating to be imaged in a low-magnification microscope (see 2D 514 imaging).

515

516 HPLC test

517 To quantify aTc concentration from LB agar fragments, we modified the method from (Halling-518 Sørensen et al., 2002). We used an Agilent 1220 Infinity LC instrument, and a C-18 519 chromatographic column (Aeris 3.6 µm Peptide XB-C18 100A LC column 250 x 4.6 mm). To 520 start, we directly tested aTc in the following amounts: 5 μ g, 2.5 μ g, 1.25 μ g, 0.625 μ g, 0.3125 521 μ g, 0,15625 μ g. From the area under peak, we generated a calibration curve and an equation 522 for aTc quantification for the following tests (Fig. S3A). We prepared triplicates of 13 mL LB agar 523 with aTc at final concentration of 100 µg/mL. Then, we poured 6 mL of each triplicate into two 524 24-well plates (1 mL/well). We prepared a total of 36 wells (triplicates for 6 reads in 2 plates). To 525 measure the aTc, we transferred the solidified media from each well to separate tubes, and we 526 diluted each with 9 mL of water. The tubes were kept in the dark and at RT for 2 hours. Then, 527 we centrifugated the tubes and filter sterilized the liquid. First, we measured triplicate samples 528 (100 μ L injection each) in HPLC before any actual incubation (day 0). Then, we incubated one 529 plate for 48 hours at 37°C (the one without a set of triplicates from day 0 read), while we 530 incubated the other plate at 4°C to recreate the two possible pre-treatments, as described in 531 Colony tests section. After the first 48 hours, we also incubated the 4°C plate at 37°C, except for 532 a set of triplicates that was kept at 4°C until the end of the experiment. We continued the 533 incubation for a total of 6 days to recapitulate the actual experimental setup (see Colony tests). 534 Each day starting at day 2, we removed a set of triplicates from each plate, then, treated and 535 injected in the HPLC as explained above. Finally, we quantified aTc by measuring the area 536 under the peak for each run.

537

538 2D imaging

539 We imaged plates with colonies with a stereo microscope (Nikon SMZ800), YFP and CFP 540 fluorescence filters (Chroma #39003 and #39001, respectively), and NIS-Elements software 541 (Nikon). QS and NQS toggles are very different circuits, and therefore, have different 542 fluorescence intensities. For this reason, we used distinct settings for each circuit. We imaged 543 QS toggle colonies with an exposure time of 300 ms for YFP and CFP. While NQS toggle had 544 lower intensities, we used an exposure time of 1 s for both YFP and CFP. We manually imaged 545 each frame for CFP, YFP and bright field to form a multichannel image. Therefore, not all 546 colonies were captured from all plates. Whenever there were many colonies, we generally 547 picked 4 frames per plate to cover as many well-separated colonies as possible. We either did 548 not image or did not analyze colonies that were in contact with other colonies. We exported 549 each multichannel image into 3 separate tiff files. We assembled colony images with Fiji 550 (ImageJ). We used identical minimum and maximum fluorescence values among images in the 551 same figure to enable direct comparison, but different values across circuits. For confocal tests, 552 we also imaged colonies with the stereo microscope before any agarose was added. In such 553 images, we used the same exposure time settings for YFP and CFP for QS and NQS toggles (1 554 s for YFP and 300 ms for CFP). In Fiji, we did not use the same adjusted minimum and 555 maximum fluorescence values for QS and NQS toggles, making these images not directly 556 comparable in respect to their fluorescence intensities.

557

558 Confocal imaging

559 We sorted single cells into LB agar plates (see Flow cytometry), containing antibiotics and aTc 560 (25 ng/ml or 50 ng/ml). We incubated the plates at 37°C, wrapped in foil, for different times, 561 ranging from 32 to 72 hours. After growth, we covered each colony with approximately 1 mL of 562 an autoclaved 1% agarose solution. For the full colony images, we cut out pieces of agar with 563 agarose-covered colonies, we placed them upside down (with agarose on bottom) on glass 564 coverslips and took them to the Nikon A1 Confocal microscope. For the perpendicular cross-565 section, we manually cut the pieces in the middle with a blade. We placed the middle part into a 566 alass coverslip for imaging on a Nikon A1 Confocal microscope. In the confocal, we used 405 567 nm and 488 nm lasers for excitation of CFP and YFP, respectively. We acquired images with 568 10x (for full colony Z-stacks) or 20x objective (for slices), resonant scanner, 1 A.U., with denoise 569 capture mode. For Z-stacks, steps varied from 5.1 to 15 μm distance, for a total of 200-500 μm 570 coverage within the Z axis. We exported the data into separate tiff files. We made videos with 571 Fiji (Image J). We used identical minimum and maximum fluorescence values among images 572 from the same circuit replicates to enable direct comparison, except for figures of slices. We

also captured colonies with stereo microscope (2D imaging) prior to agarose solution additionfor comparison.

575

576 Data analysis

577 We performed all data analyses in Matlab. First, we manually selected all colonies each frame, 578 and we took the average YFP and CFP fluorescence of four radii (one per direction: N, S, E, W) 579 per colony. We used the bright field for mask creation and detection of colonies. We selected 580 regions without colonies for background, which we subtracted from initial intensities. We saved 581 all data from all colonies in the same plate in a matrix per time point. We determined the yellow 582 width by measuring the distance from the center of the colony to the threshold point, in which 583 yellow fluorescence first reaches below 30% of its maximum. We then normalized this distance 584 by dividing with the total colony length (radius), giving results between 0 and 1. To obtain this measure we made several assumptions: if the maximum YFP value was below a certain 585 586 arbitrary threshold of 200, the yellow color was considered absent, and the normalized yellow 587 width was 1 divided by total length (close to zero). If the maximum CFP value was below an 588 arbitrary threshold of 300, the blue color was considered absent, and the normalized yellow 589 width was 1. When the maximum YFP intensity at a particular pixel also had CFP above a very 590 high second threshold of 2000, this probably represented a random patch of yellow cells 591 between blue cells, and we assumed vellow was absent for purposes of width calculation. 592 Lastly, when blue was absent, and YFP showed small variation between maximum and 593 minimum (below 170), the colony was considered completely yellow, we selected the full colony 594 as the width, instead of the highest value. We picked all these arbitrary threshold values for CFP 595 and YFP through observation. We used them equally for all colonies of both circuits. 596 Furthermore, we normalized each colony's original fluorescence data by its maximum to allow 597 for color overlap analysis. We plotted each pixel from the center to the edge of the colony by its 598 normalized YFP and CFP fluorescence, and they were only classified as overlapping when both 599 YFP and CFP values were above the threshold of 0.3. Some colonies were found to have only 600 one color throughout the entire radius, for example, some of all-vellow colonies at high aTc 601 concentration. Therefore, such colonies do not show any overlap, and can skew the data. To 602 remove single color data (Fig. S4), we selected only colonies that had both colors present for at 603 least 25% of pixels. Finally, we compared all data from QS colonies to NQS. Both yellow width 604 and overlap data showed a non-normal distribution, thus, we performed non-parametric 605 statistical tests. We analyzed comparisons among 4 different aTc concentrations of the same 606 circuit with Kruskal-Wallis test (non-parametric equivalent to one-way ANOVA), followed by

- 607 multiple comparison test (Tukey-Kramer). While we analyzed direct comparison among 2 sets of 608 data with Mann-Whitney test (non-parametric equivalent to Student's t-test).
- 609

610 Mathematical model

611 Section I – Bistability in Well-mixed Environment/Liquid Culture

- In the following we describe the set of equations modeling the concentrations of Lacl and TetR
- 613 within the cells in the population. We assume that these concentrations are approximately
- 614 proportional to the fluorescent signals which are measured experimentally and use this
- 615 assumption to compare experimental and modeling results.

616 1. Single-cell Model Derivation

- $\label{eq:constraint} 617 \qquad \mbox{We let } x(t) \mbox{ and } y(t) \mbox{ represent the concentration of Lacl and TetR, respectively. Assuming that}$
- 618 the intracellular concentrations of Lacl and TetR are proportional the concentrations of the
- fluorescent proteins YFP and CFP, respectively, the quantities x(t) and y(t) are then directly
- 620 related to the experimentally measured fluorescence. We therefore compare the evolution x(t)
- and y(t) predicted by our model to the experimentally measured fluorescence signals.
- 622 The production of Lacl is regulated by a promoter, which can be activated by QS signaling
- 623 molecules (C14-HSL bound to CinR), and repressed by TetR. Similarly, production of TetR is
- 624 activated by the QS signal (C4-HSL bound to RhIR), and repressed by LacI. We denote by g(t)
- and h(t) the concentration of QS signals C14-HSL and C4-HSL at time t, respectively. We also
- assume that Lacl and TetR can be produced at maximum rates a_1 and a_2 , and are degraded
- 627 with rate constants γ_1 and γ_2 , in addition to constant dilution at rate γ_d due to cell growth. We
- 628 can then model the dynamics of the QS toggle using the following system of ODEs describing
- 629 the intracellular concentrations of Lacl and TetR in one of the cells in the colony (Gardner et al.,
- 630 2000b; Nordholt et al., 2017; Zong et al., 2018):
- 631

$$\dot{x} = a_1 \eta_1(y) \phi_1(g) - (\gamma_1 + \gamma_d) x; \tag{1a}$$

632

$$(1) \quad (1) \quad (1) \quad (1) \quad (1)$$

$$\dot{y} = a_2 \eta_2(x) \phi_2(h) - (\gamma_2 + \gamma_d) y.$$
^(1b)

633 The repression of the promoter is represented by Hill functions η_1 and η_2 , while activation is 634 represented by Hill functions ϕ_1 and ϕ_2 . In particular, we set

635
$$\eta_1(y(t)) = \frac{\theta_y^{n_1}}{\theta_y^{n_1} + y(t)^{n_1}}, \qquad \eta_2(x(t)) = \frac{\theta_x^{n_2}}{\theta_x^{n_2} + x(t)^{n_2}}.$$
 (2*a*)

636 and

637
$$\phi_1(g(t)) = \frac{g(t)}{\theta_g + g(t)}, \qquad \phi_2(h(t)) = \frac{h(t)}{\theta_h + h(t)}.$$
 (2b)

638 Here, the choice of Hill coefficients is based on the number of monomers in the activator (1 for

639 C14 and C4) and repressor ($n_1 = 2$ for TetR and $n_2 = 4$ for Lacl).

640 We model the dynamics of the intercellular QS signals, C14-HSL and C4-HSL, whose 641 activation is repressed by TetR and Lacl, by the following equations,

- 642 $\dot{g} = a_3\beta_1 + a_3(1 - \beta_1)\eta_1(y) - (\gamma_3 + \gamma_d)g;$ (3a)
- 643

$$\dot{h} = a_4 \beta_2 + a_4 (1 - \beta_2) \eta_2(x) - (\gamma_4 + \gamma_d) h.$$
(3b)

644 Here, C14-HSL and C4-HSL are produced with maximum rate a_3 and a_4 , and degraded at rate 645 γ_3 and γ_4 , respectively. Further, let $a_3\beta_1$ and $a_4\beta_2$ represent the base production rate of the QS 646 signals. Setting $\phi_1(q(t)) = 1$ and $\phi_2(h(t)) = 1$ results in equations that describe the NQS 647 toggle.

When exogenous inducers, IPTG, and aTc, which we denote by U and V, are added to 648 649 the well-mixed liquid culture, the state of the system can be changed. Following experiments, 650 we will assume that IPTG and aTc are provided at some background concentration level, u_0 and v_0 , respectively. De-repression of the production of LacI/TetR is achieved through inducers 651 652 binding to their corresponding repressors. Let X and Y represent the unbound/free repressor, Lacl 653 and TetR, correspondingly. If \hat{X} and \hat{Y} denote the inducer-bound complex the binding activity can 654 be described by the following reaction scheme,

 $X + V \xrightarrow{k_{1+}} \hat{X}$ 655 (4*a*)

$$\hat{X} \xrightarrow{k_{1-}} X + V \tag{4b}$$

$$Y + U \xrightarrow{k_{2+}} \hat{Y}$$
(4c)

 $\hat{\mathbf{Y}} \xrightarrow{k_{2-}} \mathbf{Y} + \mathbf{U}$ 658 (4d)

Let $x_h(t)$ and $y_h(t)$ represent the concentration of bound Lacl (\hat{X}) and bound TetR (\hat{Y}), we then 659 660 have that

661

$$\dot{x}_b = k_{1+} x_f v_0 - k_{1-} x_b - (\gamma_1 + \gamma_d) x_b;$$
(5a)

$$x_b = k_{1+}x_f v_0 - k_{1-}x_b - (\gamma_1 + \gamma_d)x_b;$$
(5a)

662
$$\dot{y}_b = k_{2+}y_f u_0 - k_{2-}y_b - (\gamma_2 + \gamma_d)y_b$$
. (5b)

663 Here, $x_f(t)$ and $y_f(t)$ represents the free Lacl and TetR. By conservation law, we have that x(t) = $x_h(t) + x_f(t)$ and $y(t) = y_h(t) + y_f(t)$. 664

665 Hence, the set of equations describing the dynamics of the intracellular concentrations of 666 Lacl, TetR, the signaling molecules, as well as the concentrations of bound Lacl and TetR is 667 given by,

668
$$\dot{x} = a_1 \eta_1 (y_f) \phi_1(g) - (\gamma_1 + \gamma_d) x;$$
 (6a)

669
$$\dot{y} = a_2 \eta_2 (x_f) \phi_2(h) - (\gamma_1 + \gamma_d) y;$$
 (6b)

670
$$\dot{g} = a_3 \beta_1 + a_3 (1 - \beta_1) \eta_1 (y_f) - (\gamma_3 + \gamma_d) g; \tag{6c}$$

671
$$\dot{h} = a_4 \beta_2 + a_4 (1 - \beta_2) \eta_2 (x_f) - (\gamma_4 + \gamma_d) h;$$
(6d)

672
$$\dot{x}_b = k_{1+} x_f v_0 - k_{1-} x_b - (\gamma_1 + \gamma_d) x_b; \tag{6e}$$

$$\dot{y}_b = k_{2+} y_f u_0 - k_{2-} y_b - (\gamma_2 + \gamma_d) y_b.$$
(6f)

674 2. Nondimensionalization and Bifurcation Analysis

To simplify analysis, we next assume that $\gamma_1 = \gamma_2 = \gamma$. Defining the rescaled time $\tau = (\gamma + \gamma_d)t$,

676 we can nondimensionalize each variable using its corresponding threshold to obtain the

677 following nondimensionalized QS toggle system,

673

678
$$\frac{\mathrm{d}\tilde{x}}{\mathrm{d}\tau} = \frac{\tilde{a}_1}{1+\tilde{y}_f^{n_1}} \frac{\tilde{g}}{1+\tilde{g}} - \tilde{x}; \tag{7a}$$

679
$$\frac{d\tilde{y}}{d\tau} = \frac{\tilde{a}_2}{1 + \tilde{x}_f^{n_2}} \frac{\tilde{h}}{1 + \tilde{h}} - \tilde{y};$$
(7*b*)

680
$$\frac{\mathrm{d}\tilde{g}}{\mathrm{d}\tau} = \frac{\tilde{a}_3}{1+\tilde{y}^{n_1}} - \tilde{\gamma}_3 \tilde{g}; \tag{7c}$$

681
$$\frac{\mathrm{d}\tilde{h}}{\mathrm{d}\tau} = \frac{\tilde{a}_4}{1+\tilde{x}^{n_2}} - \tilde{\gamma}_4 \tilde{h}; \tag{7d}$$

$$\frac{\mathrm{d}\tilde{x}_b}{\mathrm{d}\tau} = \tilde{x}_f \tilde{v}_0 - \tilde{k}_{1-} \tilde{x}_b - \tilde{x}_b; \tag{7e}$$

683
$$\frac{\mathrm{d}\tilde{y}_b}{\mathrm{d}\tau} = \tilde{y}_f \tilde{u}_0 - \tilde{k}_{2-} \tilde{y}_b - \tilde{y}_b, \tag{7}$$

684 with $\tilde{x}_f = \tilde{x} - \tilde{x}_b$ and $\tilde{y}_f = \tilde{y} - \tilde{y}_b$. Here the nondimensionalized variables and parameters are,

685
$$\tilde{x} = \frac{x}{\theta_x}; \ \tilde{y} = \frac{y}{\theta_y}; \ \tilde{g} = \frac{g}{\theta_g}; \ \tilde{h} = \frac{h}{\theta_h}; \ \tilde{x}_b = \frac{x_b}{\theta_x}; \ \tilde{y}_b = \frac{y_b}{\theta_y}; \ \tilde{x}_f = \frac{x_f}{\theta_x}; \ \tilde{y}_f = \frac{y_f}{\theta_y};$$

686
$$\tilde{a}_1 = \frac{a_1}{\theta_x(\gamma + \gamma_d)}; \quad \tilde{a}_2 = \frac{a_2}{\theta_y(\gamma + \gamma_d)}; \quad \tilde{a}_3 = \frac{a_3}{\theta_g(\gamma + \gamma_d)}; \quad \tilde{a}_4 = \frac{a_4}{\theta_h(\gamma + \gamma_d)};$$

$$687 \qquad \tilde{\gamma}_3 = \frac{\gamma_3 + \gamma_d}{\gamma + \gamma_d}; \quad \tilde{\gamma}_4 = \frac{\gamma_4 + \gamma_d}{\gamma + \gamma_d}; \quad \tilde{v}_0 = \frac{k_{1+}v_0}{\gamma + \gamma_d}; \quad \tilde{u}_0 = \frac{k_{2+}u_0}{\gamma + \gamma_d}; \quad \tilde{k}_{1-} = \frac{k_{1-}}{\gamma + \gamma_d}; \quad \tilde{k}_{2-} = \frac{k_{2-}}{\gamma + \gamma_d};$$

Eq. (7) describes the NQS toggle system after removing (7c-d) and setting $\tilde{g}/(1 + \tilde{g}) = 1$ and $\tilde{h}/(1 + \tilde{h}) = 1$ in (7a-b). The nondimensionalization shows that, in the NQS toggle system, the strength of the repressor, \tilde{a}_1 and \tilde{a}_2 , is determined by a balance between production,

degradation, dilution and the repression threshold. In the QS system, the effective repressorstrength is modified by the QS signal profile. That is,

693
$$\tilde{a}_1^{\text{eff}}(t) = \frac{a_1}{\theta_x(\gamma + \gamma_d)} \frac{\tilde{g}(t)}{1 + \tilde{g}(t)}; \quad \tilde{a}_2^{\text{eff}}(t) = \frac{a_2}{\theta_y(\gamma + \gamma_d)} \frac{\tilde{h}(t)}{1 + \tilde{h}(t)}$$

To understand how the different parameters impact the equilibria of the system, we first obtain the equilibria by setting the derivatives in Eq. (7) to 0. Denoting the equilibrium values of the different dynamical variables by a star, we have that, \tilde{x}_{f}^{*} and \tilde{y}_{f}^{*} satisfy,

697
$$F_1(\tilde{x}_f^*, \tilde{y}_f^*) \coloneqq \frac{\hat{a}_1^{\text{eff}}}{1 + \tilde{y}_f^{*n_1}} - \tilde{x}_f^* = 0, \tag{8a}$$

$$F_2(\tilde{x}_f^*, \tilde{y}_f^*) \coloneqq \frac{\hat{a}_2^{\text{eff}}}{1 + \tilde{x}_f^{*n_2}} - \tilde{y}_f^* = 0,$$
(8b)

699 with

698

700
$$\hat{a}_1^{\text{eff}} = \frac{\tilde{a}_1}{1 + \hat{v}_0} \frac{\tilde{g}^*}{1 + \tilde{g}^*}, \qquad \hat{a}_2^{\text{eff}} = \frac{\tilde{a}_2}{1 + \hat{u}_0} \frac{\tilde{h}^*}{1 + \tilde{h}^*},$$

701 and

702
$$\hat{v}_0 = \frac{\tilde{v}_0}{\tilde{k}_{1-} + 1}, \qquad \hat{u}_0 = \frac{\tilde{u}_0}{\tilde{k}_{2-} + 1}$$

Let $\mathcal{L} \subset \mathbb{R}^2$ represents the bifurcation curve in the $(\hat{a}_1^{\text{eff}}, \hat{a}_2^{\text{eff}})$ parameter space, that is the curve in parameter space at which the behavior of the system changes qualitatively. Thus, crossing the bifurcation curve leads to a change in the number of equilibria and/or their stability (Kuznetsov, 2004). Except for the steady-state condition described in equations (8a-b), points on the bifurcation curve \mathcal{L} additionally must satisfy a matching slope condition (Kuznetsov, 2004). That is,

- 709 $\frac{\partial F_1 / \partial \tilde{x}_f^*}{\partial F_1 / \partial \tilde{y}_f^*} \bigg|_{\left(\hat{x}_f^*, \hat{y}_f^*\right)} = \frac{\partial F_2 / \partial \tilde{x}_f^*}{\partial F_2 / \partial \tilde{y}_f^*} \bigg|_{\left(\hat{x}_f^*, \hat{y}_f^*\right)}.$
- 710 After some algebra, the above condition can be simplified as following,
- 711

 $\hat{a}_1^{\text{eff}} \, \hat{a}_2^{\text{eff}} = n_1 n_2 \hat{x}_f^{*n_2+1} \hat{y}_f^{*n_1+1}. \tag{8c}$

Solving system (8) numerically gives us the cusp bifurcation curve \mathcal{L} in the $(\hat{a}_1^{\text{eff}}, \hat{a}_2^{\text{eff}})$ space, as

shown in Figure 2E. Nullclines plotted in Figure 2F, G are given by solving system (8a-b) for

714 $\hat{a}_1^{\text{eff}} = 3/(1+\hat{v}_0) \text{ and } \hat{a}_2^{\text{eff}} = 3/(1+\hat{u}_0).$

715

716 Section II – Spatial-temporal Dynamics of the NQS and QS colony

717 Using the model of the intracellular dynamics developed above, we next describe a model of the

spatiotemporal dynamics of the corresponding quantities in a growing bacterial colony.

719 **1. Domain**

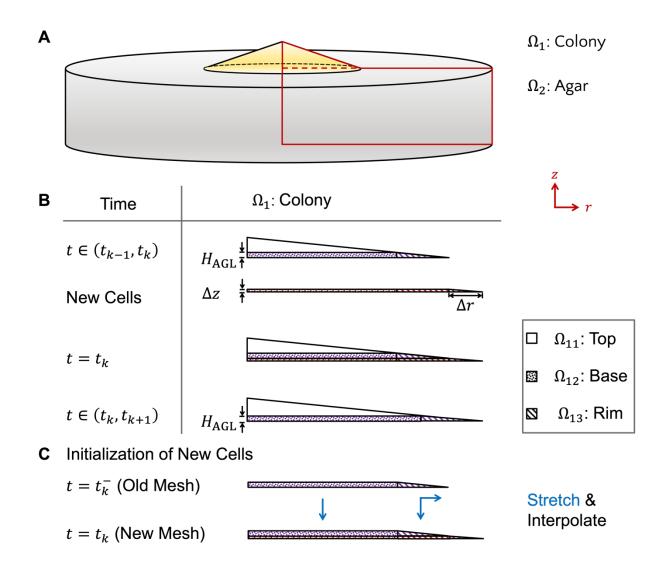
- The domain, $\Omega \subseteq \mathbb{R}^3$, on which we define the model consists of two different subdomains, $\Omega =$
- 721 $\Omega_1 \cup \Omega_2$, with Ω_1 representing the part of the domain occupied by the bacterial colony, and Ω_2

the part occupied by the agar. The agar plate takes the shape of a cylinder, and we assume that
the colony takes shape of a cone (Warren et al., 2019b), as show in Fig. S7A. Assuming radial
symmetry, we can reduce the 3D domain to a 2D slice.

There are two different types of boundaries: The inner boundary, represented by $\partial \Omega^{in}$, and the outer boundary, represented by $\partial \Omega$. The inner boundary is the interface between the colony subdomain, Ω_1 , and the agar subdomain, Ω_2 . The outer boundary is the union of the colony-air interface and the agar-plate interface.

The colony is observed experimentally over tens of hours during which it can grow substantially. We therefore include colony growth in the model. Previously, Warren et al. (2019) have identified three phases of colony expansion: The initial monolayer phase (0-13 h); the establishment phase (14-24 h); the flattening phase (24+ h). In the establishment phase, growth in both height and radius is linear, as cells predominantly divide in the active growing region consisting of a thin disk at the bottom of the colony of approximate height $H_{AGL} = 10 \ \mu m$. During the flattening phase, radial growth is still linear while the increase in height slows.

736 In our case, the observed pattern in both the NQS and QS colony is driven by diffusive 737 signals. Since the size the colony is much smaller than the characteristic length scale of signal 738 diffusion during the experiments, details quantitative description on how the colony grows 739 vertically do not matter much. Therefore, for simplicity we assume that the colony expands 740 linearly in both radius and height, with a thin actively growing layer on the bottom. These 741 assumptions together imply a fixed aspect ratio in colony height vs radius. In our simulation, the 742 continuous growth of the colony is discretized by adding slabs of uniform heights and linearly 743 increasing radius every unit time. In particular, in experiment the radius of the colony by the end 744 of 100 hours is approximately 4 mm, giving a linear radius growth rate of $v_r = 40 \ \mu m/h$. 745 Moreover, the cross-sectional images of the colony show that at different times of colony 746 expansion, the height to radius ratio ranges from 1:7 to 1:12. For simplicity, we assume a fixed 747 ratio of the height to base in the triangular slice to be 1:10, which leads to a linear height growth 748 rate of $v_h = 4 \, \mu m / h$.



749 750

751 Supplement Figure 7: Schematics of the 3D domain and the discretization of the colony expansion used in 752 numerical simulations. A) We assume a cone shaped growing colony sits on top of the cylindrical agar pad. The 753 red curves outline a 2D slice from the 3D domain, in the radial (r) and height (z) direction. Assuming radial symmetry, 754 which is consistent with experimental observations, we used this 2D slice as the domain for the model. The solid line 755 represents the outer boundary ($\partial \Omega$) while the dashed line represents the inner boundary ($\partial \Omega^{in}$). **B**) Growth is 756 modeled by updating the colony's shape at even increments in time, Δt . At the end of each subinterval, the domain of 757 the colony, Ω_1 , is increased by adding a rectangle of height Δz and of width equal to that of the colony, and an 758 adjoining right triangle of height Δz with base Δr . Here, we discretize time into intervals (t_{k-1}, t_k) , with $t_k = k \cdot \Delta t$. C) 759 After every increment of time, a new mesh is generated for the expanded colony. The new nodes at the Top and Rim 760 region are initialized by interpolating the solution of the corresponding region from the stretched old mesh. 761

As shown in Fig. S7B, based on growth assumption at different locations, we divide the colony subdomain Ω_1 into three different regions, top (Ω_{11}) , base (Ω_{12}) , and rim (Ω_{13}) . In particular, the triangular top, defined as $\Omega_{11} = \{(r, z) \in \Omega_1 | z \ge H_{AGL}\}$, doesn't grow. Let R_k represents the radial length of the colony at the end of time intervals (t_{k-1}, t_k) . The rectangular base, defined as $\Omega_{12} = \{(r, z) \in \Omega_1 | r \le R_k, z \le H_{AGL}\}$, grows linearly only in the vertical direction. The triangular rim, defined as $\Omega_{13} = \{(r, z) \in \Omega_1 | r \ge R_k\}$, grows linearly in both the

768 vertical and radial direction. $(r, z) \in \Omega_1 | r \ge R_k$; grows in

Let *T* be the time it takes for the colony to grow H_{AGL} in the vertical direction. Here, *T* = $H_{AGL}/v_h = 150 \text{ min.}$ Let S_k^{12} represents the area of the top region, Ω_{12} , at the end of time interval (t_{k-1}, t_k) , where $S_k^{12} = H_{AGL}R_k$. Then we have that

772
$$\frac{S_{k+1}^{12} - S_k^{12}}{\Delta t} = \frac{\Delta H}{\Delta t} R_k = \frac{H_{\text{AGL}}}{T} R_k = \frac{1}{T} S_k^{12}.$$

Similarly, let S_k^{13} represents the area of the rim region, Ω_{13} , at the end of time interval (t_{k-1}, t_k) ,

774 where $S_k^{13} = \kappa H_{AGL}^2/2$, with κ represent the fixed radius-height ratio of the colony. Then we have

775
$$\frac{S_{k+1}^{13} - S_k^{13}}{\Delta t} = \frac{\Delta H}{\Delta t} \kappa \left(H_{AGL} + \frac{1}{2} \Delta H \right) = \frac{H_{AGL}}{T} \kappa \left(H_{AGL} + \frac{1}{2} \Delta H \right) = \frac{2}{T} S_k^{13} + O(\Delta H).$$

Therefore, we can approximate the expansion factor of the rim region, Ω_{13} , by 2/T, which is

twice as fast as the expansion rate base region, Ω_{12} . Let $\gamma_d = 1/T$, we then get that the

following chemical dilution rate from colony expansion in the different regions,

779
$$\gamma_d(X) = \begin{cases} 0, & X \in \Omega_{11}; \\ \gamma_d, & X \in \Omega_{12}; \\ 2\gamma_d, & X \in \Omega_{13}. \end{cases}$$

780

781 2. PDE Model

Let u(X, t) represent the aTc concentration at time t and location $X \in \Omega$. The inducer, aTc, is initially supplied in the agar, which then diffuses into the colony and react with TetR in different cells. The reaction occurring within the cells in the colony can be modeled using Eqs. (4c, d). We assume that when the aTc-TetR complex, \hat{Y} , is being degraded by the enzyme ClpXP, and that a portion $\alpha \in [0,1]$ of the aTc returns to the cell from the complex (Nevozhay et al., 2009). That is,

789
$$\widehat{Y} \xrightarrow{\alpha(\gamma_2 + \gamma_d(X))} \phi + U.$$

788

790 Putting everything together, for the concentrations of,

791 $x: [LacI]; y_f: [free TetR]; y_b: [bound TetR]; g: [C14]; h: [C4]; u: [aTc],$

with $y = y_f + y_b$, and the superscript represent different subdomain, we obtain a diffusion-

793 reaction model we describe next.

In the colony domain, $X \in \Omega_1$, the various concentrations evolve according to,

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795
$$\frac{\partial x}{\partial t} = a_1 \eta_1 (y_f) \phi_1(g) - (\gamma_1 + \gamma(X)) x, \qquad (9a)$$

796
$$\frac{\partial y}{\partial t} = a_2 \eta_2(x) \phi_2(h) - (\gamma_2 + \gamma(X))y, \qquad (9b)$$

797
$$\frac{\partial y_b}{\partial t} = k_{2+}u^c y_f - k_{2-}y_b - (\gamma_2 + \gamma(X))y_b, \qquad (9c)$$

798
$$\frac{\partial g^c}{\partial t} = D_1^c \Delta g^c + a_3 \beta_1 + a_3 (1 - \beta_3) \eta_1 (y_f) - (\gamma_3 + \gamma(X)) g^c, \qquad (9d)$$

799
$$\frac{\partial h^c}{\partial t} = D_2^c \Delta h^c + a_4 \beta_4 + a_4 (1 - \beta_4) \eta_2(x) - (\gamma_4 + \gamma(X)) h^c, \qquad (9e)$$

801
$$\frac{\partial u^{c}}{\partial t} = D_{3}^{c} \Delta u^{c} - k_{2+} u^{c} y_{f} + k_{2-} y_{b} + \alpha (\gamma_{2} + \gamma_{d}(X)) y_{b} - (\gamma_{5} + \gamma(X)) u^{c}.$$
(9*f*)

800 In the agar domain, Ω_2 , we have

$$\frac{\partial g^a}{\partial t} = D_1^a \Delta g^a - \gamma_3 g^a, \tag{9g}$$

803
$$\frac{\partial h^a}{\partial t} = D_2^a \Delta h^a - \gamma_4 h^a, \tag{9h}$$

804
$$\frac{\partial u^a}{\partial t} = D_3^a \Delta u^a - \gamma_5 u^a. \tag{9i}$$

Here D_i^a denotes the signal diffusion coefficient in agar, for different chemicals C14, C4 805 and aTc indexed by i = 1,2,3 respectively. Due to the crowdedness of the colony, we assume that 806 signal diffusion coefficients in the colony, D_i^c , satisfies $D_i^c < D_i^a$. In particular, it has been shown 807 that GFP diffuse 10 times faster in water ($D_{GFP}^{aqua} \approx 87 \mu m^2/s$)(Swaminathan et al., 1997), compared 808 with in the cytoplasm ($D_{GFP}^{cyto} \approx 8\mu m^2/s$) (Elf et al., 2007). Therefore, we set $D_i^a = 10D_i^c$. Since aTc 809 810 has a lower molecular weight than GFP, we assume that the aTc diffusion coefficient in agar is $D_1^a = 400 \ \mu m^2/s$. It has been reported that the effective diffusion coefficients of C14 and C4 are 811 $D_{C14} \approx 83 \mu m^2/s$ and $D_{C4} \approx 1810 \mu m^2/s$ (Karig et al., 2018). Here we set the diffusion coefficients 812 in agar to $D_2^a = 10^2 \,\mu\text{m}^2/\text{s}$ and $D_3^a = 10^3 \,\mu\text{m}^2/\text{s}$, for C14 and C4, respectively. 813

For the diffusible chemicals, C = g, h, or u, we also we the following inner and outer boundary conditions.

816

802

16
$$C^{a}(X,t)|_{X\in\partial\Omega^{\mathrm{in}}} = C^{c}(X,t)|_{X\in\partial\Omega^{\mathrm{in}}},$$
 (9j)

817
$$\boldsymbol{n} \cdot D_i^a \nabla C^a(X, t)|_{X \in \partial \Omega^{\text{in}}} = -\boldsymbol{n} \cdot D_i^c \nabla C^c(X, t)|_{X \in \partial \Omega^{\text{in}}},$$
(9k)

818

 $\boldsymbol{n} \cdot D_i^{a/c} \nabla C^{a/c}(X,t) \big|_{X \in \partial \Omega} = 0.$ (91)

819 We used the radial symmetry of the 3D domain to reduce it to an equivalent 2D model.

Let *r* and *z* represent the independent variables denotes the radius and height coordinate inside the colony. We then have that the Laplacian operator acts on C = g, h, or *u* as 822

$$\Delta C = \frac{1}{r} \frac{\partial}{\partial r} \left(r \frac{\partial C}{\partial r} \right) + \frac{\partial C}{\partial z}$$

823

824 Parameters and Simulation

825 We assume the tagged degradation gives a half-life of 7 min for intercellular species (Chen et 826 al., 2015). This leads to degradation rates of Lacl and TetR of $\gamma = \gamma_1 = \gamma_2 = \ln(2) / 7 \min^{-1}$. It 827 has been reported that the degradation rate of AHL ranges from zero (no detectable 828 degradation at 32 hours) to a half-life of 8 hours depending on environmental factors such as 829 temperature and pH value (Politi et al., 2014). For our experimental condition, we assume that 830 the half-life of C14 and C4 is 24 hours, corresponding to degradation rates of $\gamma_3 = \gamma_4 =$ $\ln(2)/24 h^{-1}$. The production rates of each species, a_i , with i = 1, ..., 4 along with their 831 832 corresponding threshold of activation (EC50)/repression (IC50) parameters θ_i , with j =833 $\{x, y, g, h\}$, were chosen so that the nondimensionalized parameters, \tilde{a}_i , give a match with 834 experimentally observed patterns. We also set the basal production level of the AHL signals to $\beta_1 = 0.2$ and $\beta_1 = 0.5$, for C14 and C4 respectively. It has been reported that aTc bind with TetR 835 836 at rate, $k_{+} = 0.06/nM/min$ (Nevozhay et al., 2009). As shown in Fig 1E and G, aTc can induce 837 the vellow state at a concentration of 1 ng/ml in the NQS, and at approximately 10 ng/ml in the 838 QS case. Therefore, we set $k_{+} = k \cdot 0.06 \text{ nM}^{-1} \text{min}^{-1}$, with k = 1 in the NQS case and k = 10 in 839 the QS case. We set the unbinding rate to $k_{-} = k_{+}/k_{A}$, with association constant $k_{A} = 10 \text{ nM}^{-1}$ 840 (Kintrup et al., 2000). When the aTc-TetR complex is degraded by ClpXP, we assume that $\alpha =$ 841 0.8 portion of the aTc in the complex returns back to the cell. All parameters used in Figure 842 7C,D are the same as those used in Figure 7B except the following: in Figure 7C, a pulse of $\gamma =$ 843 $\ln(2)/5.178 \text{ min}^{-1}$ between t = 23.25 hr and t = 25.575 hr is applied; in Figure 7D, repressor 844 strengths are reduced to $a_1 = 80 \text{ nM/min}$ and $a_2 = 120 \text{ nM/min}$.

845 We simulate the PDE-ODE model, described by Eqs. (9) using MATLAB. To reduce 846 interpolation error, we took the following approach: First, over $\delta t = 1$ min time intervals, the 847 PDEs were solved using the Partial Differential Equation Toolbox and the ODEs were solved 848 using ode15s at each mesh point, using the solution from the previous time step as initial 849 conditions. Second, the mesh for subdomain Ω_{11} , the top of the colony, was kept the same 850 between each update of the colony size at every $\Delta t = 15$ min. Meanwhile, at each colony 851 growth update time point $t = t_k$, as shown in Figure S1B, mesh points in the bottom layer (Ω_{12}) 852 and Ω_{13}) were initialized by interpolating the solution at $t = t_k^-$ with the coordinates of the mesh 853 points linearly stretched, as shown in Figure S1C.

854

855 Supplemental information titles and legends

856 Supplemental Figure 1: Individual behavior of QS and NQS toggle cells when treated with 857 a single inducer for different duration of times. Flow cytometry data of QS and NQS toggle 858 cells that were pre-induced with either IPTG or aTc. Each dot is a single cell classified within a 859 gate. Gates were determined with single color and double negative controls. Dashed lines in each 860 plot represent the boundaries between the three distinct gates, which represent cellular states: 861 CFP+ (top gate), YFP+ (bottom-right gate), and OFF (bottom-left gate). Background colors in 862 each plot represent which state the majority of cells are in (>50%): blue color indicates mostly 863 CFP+ cells, yellow plots are mostly YFP+, gray plots are mostly OFF, and white plots indicate 864 cells that are present in multiple states (<50% each). A) QS toggle cells pre-treated with IPTG 865 and aTc after growth for 3 (top), 9 (middle), and 12 hours (bottom). B) NQS toggle cells pre-866 treated with IPTG and aTc after growth for 3 (top) and 9 hours (bottom) (see Fig. 2).

867

868 Supplemental Figure 2: Induction curves of circuit variations of the QS toggle. We obtained 869 the Weaker Blue State by using lower strength promoters for *tetR* and *cfp* genes. We obtained 870 the Weaker QS toggle by using lower strength promoters for the circuit genes, except both QS 871 genes which were kept the same. We obtained the Inverted QS toggle by using the same lower 872 strength promoters but reversing the QS network connected to each state: now, the rhIR/I network 873 activates the yellow state, and cinR/I the blue state. A, B) Induction curves of Weaker Blue State 874 QS toggle with IPTG (A) and aTc (B) in liquid culture. C, D) Induction curves of Weaker QS toggle 875 with IPTG (C) and aTc (D) in liquid culture. E, F) Induction curves of Weaker QS toggle with IPTG 876 (E) and aTc (F) in liquid culture, in which cells were pre-treated with IPTG. G, H) Induction curves 877 of weaker QS toggle with IPTG (G) and aTc (H) in liquid culture, in which cells were pre-treated 878 with aTc. I, J) Induction curves of Inverted QS toggle with IPTG (I) and aTc (J) in liquid culture. 879 Lines represent the average fluorescence and error bars represent the standard deviation of 3 880 technical replicates for at least 3 independent experiments (see Fig. 1).

881

Supplemental Figure 3: Incubation at 37°C causes aTc degradation. A) Yellow ring width measured from QS toggle colonies grown in aTc plates pre-incubated either at 4°C or 37°C for 48 hours prior to plating. Then, we plated and grew cells as shown in Fig. 3A. These values represent yellow ring widths from 76h post-plating. The 37°C plates showed a significant decrease in width in comparison to its 4°C counterparts, except at 12.5 ng/ml (**p* < 0.01, Mann-Whitney non-parametric test). Data is from 5 independent experiments. Pre-4°C colonies are included in Fig. 3B. **B)** ATc quantification from LB agar extracts (in the absence of cells) with an HPLC. At time 0, aTc was quantified before any incubation. Samples were divided in two groups: preincubation for 48 hours at 37°C (bright blue), or 4°C (light blue) to recreate the experimental timeline in (A). On day 2, we incubated both groups at 37°C until day 6 to also recapitulate the experimental setup. As a control (gray), LB agar + aTc samples were kept at 4°C throughout the entire test and measured on day 7. Data represents mean ± standard deviation of 3 independent experiments (see Fig. 3).

895

Supplemental Figure 4: Quantification of pixel overlap for QS toggle (light gray) and NQS toggle (dark gray) colonies without single color data. We selected only colonies that have both colors present for at least 25% of the radius. We normalized the number of overlapping pixels by the colony radius (total pixels) (p < 0.01, Mann-Whitney non-parametric test). Data for each QS toggle test contains over 138 colonies from at least 11 independent experiments, while data for each NQS test contains at least 5 colonies from 2 independent experiments (see Fig. 4).

902

903 Supplemental Figure 5: Multiple blue rings are also observed in LB agar QS colonies. A) 904 Example of colony obtained from a 50 ng/ml aTc plate, over time. **B**, **C**) Fluorescence intensity 905 cross-section at 52h and 76h, respectively, shown in (A). Curves are the average fluorescence 906 between 4 radii of the same colony. **D**, **E**) We plotted each colony pixel from the images at 52h 907 and 76h, respectively, for both normalized fluorescence values. We classified pixels as 908 overlapping when both normalized fluorescence values were above a threshold of 0.3 (inside the 909 aray boxed region). Curves are the average fluorescence between 4 radii of the same colony. F) 910 Example of imperfectly symmetrical internal blue rings from a different colony at 52 hours post-911 plating (see Fig. 7).

912

913 Supplemental Figure 6: Expanding QS colonies in EZ rich defined medium. A) Colonies 914 obtained from plates with different aTc concentrations, over time. At 100 ng/ml aTc, colonies 915 remained all yellow or with blue center or internal ring fragments. B) We used the measurement 916 of color overlap to quantify the spatial segregation of states per colony. We classified pixels as 917 overlapping when both normalized fluorescence values were above a threshold of 0.3. 918 Measurement of overlap was normalized by the colony radius (total number of pixels). Data is 919 from 2 independent experiments. C) Fluorescence intensity cross-sectionals of colonies shown in 920 (A). Curves are the average fluorescence between 4 radii of the same colony (see Fig. 7).

921

922 Supplement Figure 7: Schematics of the 3D domain and the discretization of the colony

923 expansion used in numerical simulations. A) We assume a cone shaped growing colony sits 924 on top of the cylindrical agar pad. The red curves outline a 2D slice from the 3D domain, in the

- 925 radial (r) and height (z) direction. Assuming radial symmetry, which is consistent with
- 926 experimental observations, we used this 2D slice as the domain for the model. The solid line
- 927 represents the outer boundary $(\partial \Omega)$ while the dashed line represents the inner boundary $(\partial \Omega^{in})$.
- 928 **B)** Growth is modeled by updating the colony's shape at even increments in time, Δt . At the end
- 929 of each subinterval, the domain of the colony, Ω_1 , is increased by adding a rectangle of height
- 930 Δz and of width equal to that of the colony, and an adjoining right triangle of height Δz with base
- 931 Δr . Here, we discretize time into intervals (t_{k-1}, t_k) , with $t_k = k \cdot \Delta t$. **C)** After every increment of
- 932 time, a new mesh is generated for the expanded colony. The new nodes at the Top and Rim
- 933 region are initialized by interpolating the solution of the corresponding region from the stretched 934 old mesh (see Fig. 5).
- 935

936 Supplement Movie 1: Patterning in the expanding NQS toggle colony. Once aTc drops 937 below the hysteresis point, cells from the top start to switch to the blue state. Sequestration and 938 degradation of aTc leads to the further spreading of the blue wave. Top: aTc profile at different 939 locations of the colony. Middle: 2D colormap of the Lacl and TetR profile at different locations of 940 the colony. Bottom three panels on left: normalized Lacl and TetR concentration in the top-down 941 view of the colony. Bottom right: Evolution of the effective promoter strength at the top and rim 942 of the colony.

943

944 Supplement Movie 2: Patterning in the expanding QS toggle colony. Faster growth and 945 balance of the QS signals at the rim leads to cells switching to the blue state. Bistability in the 946 non-growing top leads to preservation of the yellow/blue states, as new cells are pushed out of 947 the actively growing layer. This leads to a stable switching boundary in the radial direction. Top: 948 aTc profile at different locations of the colony. Middle: 2D colormap of the Lacl and TetR profile 949 at different locations of the colony. Bottom three panels on left: normalized Lacl and TetR 950 concentration in the top-down view of the colony. Bottom right: Evolution of the effective 951 promoter strength at the top and rim of the colony. 952

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- 954
- 955

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