

# Tunable synthetic phenotypic diversification on Waddington's landscape through autonomous signaling

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**Phenotypic diversification of cells is crucial for developmental and regenerative processes in multicellular organisms. The diversification concept is described as the motion of marbles rolling down Waddington's landscape, in which the number of stable states changes as development proceeds. In contrast to this simple concept, the complexity of natural biomolecular processes prevents comprehension of their design principles. We have constructed, in *Escherichia coli*, a synthetic circuit with just four genes, which programs cells to autonomously diversify as the motion on the landscape through cell-cell communication. The circuit design was based on the combination of a bistable toggle switch with an intercellular signaling system. The cells with the circuit diversified into two distinct cell states, "high" and "low," in vivo and in silico, when all of the cells started from the low state. The synthetic diversification was affected by not only the shape of the landscape determined by the circuit design, which includes the synthesis rate of the signaling molecule, but also the number of cells in the experiments. This cell-number dependency is reminiscent of the "community effect": The fates of developing cells are determined by their number. Our synthetic circuit could be a model system for studying diversification and differentiation in higher organisms. Prospectively, further integrations of our circuit with different cellular functions will provide unique tools for directing cell fates on the population level in tissue engineering.**

biological engineering | mathematical modeling | synthetic biology

**P**henotypic diversification of cells in developmental and regenerative processes is conceptually modeled as the motion of marbles rolling down Waddington's landscape (1). The simple concept of the landscape is helpful to interpret the dynamic phenotypic changes in natural phenotypic diversification from bacteria to mammalian cells (2). In contrast, the complex interactions of genes governing the natural diversification prevent the elucidation of its design principles, which are essential characteristics of phenomena, despite a wealth of knowledge on the individual genes governing the processes.

Because the landscape contains bifurcations, which are changes in the numbers of stable states, developing cells on the landscape differentiate into various cell states through developmental progression. Reprogramming of differentiated cells to pluripotent cells (3–5) revealed that the progression results from changes in the expression status of genes in individual cells, rather than simply the passage of time. For changes in the expression status, intercellular signaling cannot be ignored, because gene expression is regulated not only by genes in individual cells, but also by cell-cell communication. Such communication is also known to be important in cellular decision making in bacteria (2, 6).

To investigate the design principles for intricate natural phenomena, simple synthetic gene circuits that emulate these phenomena through the integration of theory and experiment (2, 7–15) can be efficient tools, regardless of whether the mole-

cules used in the synthetic gene circuits are the same as those used in the natural circuits (15) or not (7–14, 16). The construction of a genetic toggle switch (8), a mutual inhibitory circuit that exhibited bistability in silico and in vivo, was an important milestone for the integration. The genetic toggle switch revealed that the circuits with balanced and imbalanced protein-synthesis rates resulted in bistability and monostability, respectively. Another example of the integration is the study of a population-control circuit (9), which includes intercellular signaling. This study demonstrated that population dynamics in vivo can be tuned by varying the stability of the intercellular signaling molecule, as predicted by numerical simulation. Other synthetic circuits with intercellular signaling systems have also been constructed to program cells to work as a population (9–12, 14, 17, 18). We expected that emulating the landscape with intercellular signaling would help to clarify the importance of cell-cell communication in the natural phenotypic diversification.

In this study, using an *Escherichia coli* population, we implemented a synthetic phenotypic diversification as the motion on the landscape, of which the bifurcation is mediated by the concentration of an intercellular signaling molecule autonomously produced by the cells (Fig. 1A). To implement the synthetic diversification, a diversity-generator circuit was designed with only four genes, based on the combination of a bistable toggle switch (8) with an intercellular signaling system (Fig. 1B). The *Escherichia coli* population diversified in silico and in vivo into two distinct cell states: high and low, when the cells were initialized to the low state. The phenotypic balance after the synthetic diversification primarily depended on the velocity of the signaling-molecule accumulation, which was mainly determined by the cell density and the rates of the signaling-molecule production in individual cells. This cell-number dependency with the landscape concept has implications for investigations and applications of developmental and regenerative processes in which the cell number is important. Thus, our simple circuit could be a model system to provide insights into fundamental processes of development and regeneration.

## Results

**Design of the Diversity Generator to Implement the Synthetic Diversification.** The diversity-generator design includes an intercellular signaling mechanism and an intracellular bistability mechanism (Fig. 1B). The intercellular signaling mechanism was developed

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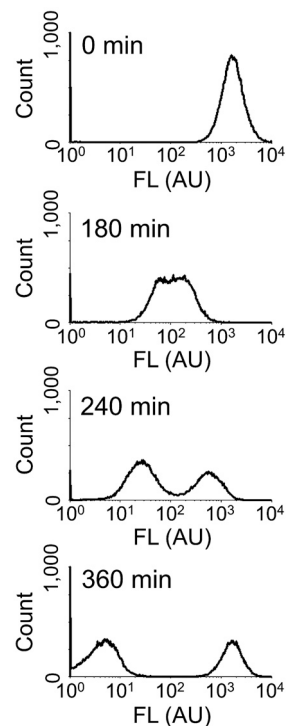


finally exhibited a monomodal distribution with the low state (Figs. S24 and S34). Another monomodal distribution with the high state was observed from the cell population distributed in only the high basin (Figs. S2C and S3C). The velocity of AHL accumulation depends on two parameters: the initial cell density and the AHL-production rate of single cells. Therefore, appropriate combinations of these two parameters are required for the diversification.

**Construction of the Diversity Generator.** To experimentally confirm the AHL-mediated bifurcation of the diversity generator, we constructed a pHT-toggle plasmid carrying a subcircuit of the diversity generator, by replacing the  $P_{trc-2}$  promoter on the genetic toggle switch pTAK132 (8) with the  $P_{lux/lac}$  promoter (Fig. S14). The HT-toggle cells can be initialized to either state by appropriate culture conditions. Both states were confirmed to be stable in the presence of AHL, by the fact that the addition of AHL just after the initializations resulted in minimal changes of the cell state from each initial state (Fig. S4). In addition to this bistability in the presence of AHL, monostability with the high state in the absence of AHL was confirmed by observations that the low-state cells transit to the high state, and the high-state cells maintain their state (Fig. S4). By changing the timing of the AHL addition, the pHT toggle provided additional experimental evidence that the diversification via the bifurcation with the increase in the AHL concentration could work (Fig. S5). During the above transition of the low-state cells in the absence of AHL, the addition of AHL made both states stable. Thus, part of the population returned to the low state and the rest transited to the high state when the timing of the AHL addition was appropriate (Fig. S5A), such as at 120 min in the experiments (Fig. S5B). As a result, the cell population finally exhibited a bimodal distribution. In contrast, early AHL addition, such as 0 min, resulted in a monomodal distribution with the low state. Another monomodal distribution with the high state was observed with later AHL addition, such as at 240 min.

For autonomous signal production in our diversification, we placed a luxI variant, designed from known variants (20), downstream of the LacI-coding sequence on pHT toggle to obtain the diversity-generator plasmid, pHT\_luxI1.5C (Fig. S14). Similar to the HT-toggle cells, the HT\_luxI1.5C cells can be initialized to either state. Because the HT\_luxI1.5C cells can produce an appropriate amount of AHL by themselves, they autonomously diversified, as defined in Fig. 1A (Fig. 3), after the initialization to the low state, with high GFP fluorescence. Through the gradual decline of fluorescence, this monomodal distribution at 0 min turned into a monomodal distribution with midrange fluorescence at 180 min, at which the cell population started to divide. The cell population then exhibited a bimodal distribution at 240 min. After 360 min of incubation from the initialization, the cell population finally exhibited another bimodal distribution, in which the distance between the two fluorescent peaks was greater than that at 240 min.

**Dependency of the Synthetic Diversification on the Velocity of AHL Accumulation.** Based on the notion of the landscape (Fig. 1A) and the numerical simulations (Fig. 2, Figs. S2 and S3, and Tables S3 and S4), the velocity of AHL accumulation in the medium is important for the synthetic diversification. The velocity depends on the AHL-synthesis rate of single cells and the cell density. To experimentally confirm the importance of the velocity, we monitored the behavior after changing the AHL-synthesis rate of single cells. To change the rate, we constructed the pHT\_luxI1A and pHT\_luxI2A plasmids, which produce less and more AHL than the pHT\_luxI1.5C plasmid, respectively (Table S3). The GFP expression histograms of the cells with each of the three plasmids are shown in Fig. 4A–C. The low and high AHL-production rates led to monomodal cell distributions with the high state (Fig. 4A)



**Fig. 3.** Fluorescence histograms of HT\_luxI1.5C cells at various time points. Cells with HT\_luxI1.5C initialized to the low-state diversify into the high and low states. FL indicates the intensity of GFP fluorescence.

and the low state (Fig. 4C), respectively. To confirm the importance of the velocity, we also monitored the behavior of the diversity-generator cells by preparing the initial cell cultures with a high, appropriate, or low density (Table S4). The fluorescence histograms of the HT\_luxI1.5C cells, after the initialization and incubation under the three cell-density conditions, are shown in Fig. 4D, B, and E. Similar to the AHL-synthesis rate of single cells, the difference in the cell-density conditions changed the cell distributions, in terms of the balance between the numbers of high- and low-state cells (Fig. 4D and E).

## Discussion

We demonstrated, *in vivo* and *in silico*, that the initial cell density plays an important role in the synthetic diversification (Fig. 4D, B, and E), in which the phenotypic change of cells was described by the motion of marbles on Waddington's landscape. The dependency on the cell number in our results is reminiscent of the community effect observed in developmental systems (21, 22). The dependency also resembles quite recent findings, such as the cell-number dependency of the embryonic cell population to direct cell fate (23–25). Our simple circuit design, consisting of just four genes, is a gene-network design candidate for natural diversifications depending on cell density, which is equivalent to cell number in a constant volume. Future investigations will include the comparison of our simple circuit to natural gene circuits governing natural diversification. The dynamic behavior in the synthetic diversification is also reminiscent of the maintenance of the phenotypic diversity of cells. According to a recent study, the utmost removal of pancreatic  $\beta$ -cells caused the transdifferentiation of  $\alpha$ -cells into  $\beta$ -cells (26). Comparisons between the pancreatic circuits and ours, which involves mutual inhibition and intercellular signaling, may provide clues for investigations of pancreatic transdifferentiation.

In spite of frequent references to the concept of the landscape in various reviews about developmental and regenerative processes, the existence of genetic circuits that program cells to diversify as the motion on Waddington's landscape had not been





with the restriction sites was cleaved by the restriction enzymes and inserted into the same sites of pHT-toggle to create the diversity-generator plasmid, pHT\_luxlWT. The pHT\_luxl variants were obtained by mutating the Luxl-coding sequence, using a QuickChange site-directed mutagenesis kit (Stratagene). We constructed several Luxl variants by combining mutations of three nucleotides in the Luxl-coding sequence, A101G, A117T, and A188G, as reported by Kambam et al. (20). The pHT\_luxl1.5C plasmid was obtained by mutating A117T/A188G. Luxl1A and luxl2A contain the A101G and A101G/A117T/A188G mutations, respectively (20).

**Diversity-Generator Assay Protocol.** An overnight culture of cells with an HT\_luxl variant was diluted 100-fold into 3.0 mL of fresh LB medium with antibiotics (50  $\mu\text{g}/\text{mL}$  carbenicillin and 30  $\mu\text{g}/\text{mL}$  kanamycin), referred to as "basal medium." The cells were grown at 37 °C until the cell population reached a sufficient density ( $\text{OD}_{590} = 0.35$ ). For initialization of the cells, 1.0 mL of the culture with the sufficient density was washed with 1.0 mL of fresh basal medium by centrifugation. The washed cells were then inoculated into 100 mL of medium with a combination of 1.0  $\mu\text{M}$  AHL and 2.0 mM IPTG, and incubated at 32 °C for 240 min for initialization to the low state. For the diversification, a 2.0 mL portion of the cell culture was washed three times with 1.0 mL of the basal medium by centrifugation, to remove the IPTG and AHL from the culture. The washed cells were then diluted to the target

optical density, referred to as the "initial cell density," into 100 mL of basal medium. After the dilution, the cells were grown at 32 °C for 360 min. We measured the GFP fluorescence of the cells at appropriate times after the dilution. The initial cell density for the assays, except for those shown in Fig. 4 D and E, was  $\text{OD}_{590} = 3.0 \times 10^{-4}$ . The initial cell densities in Fig. 4 D and E were  $\text{OD}_{590} = 1.0 \times 10^{-5}$  and  $2.0 \times 10^{-3}$ , respectively.

**Fluorescence Measurement.** All fluorescence data were collected using a Becton-Dickinson FACSCalibur flow cytometer with a 488-nm laser and a 515–545-nm emission filter. Before measurement, the cells were washed with PBS by centrifugation.

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