Synthetic Biology-

Characterization and Modeling of Transcriptional Cross-Regulation in *Acinetobacter baylyi* ADP1

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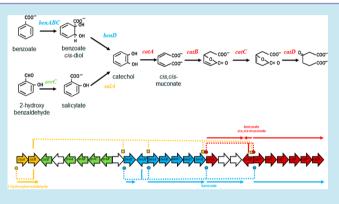
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Supporting Information

ABSTRACT: Synthetic biology involves reprogramming and engineering of regulatory genes in innovative ways for the implementation of novel tasks. Transcriptional gene regulation systems induced by small molecules in prokaryotes provide a rich source for logic gates. Cross-regulation, whereby a promoter is activated by different molecules or different promoters are activated by one molecule, can be used to design an OR-gate and achieve cross-talk between gene networks in cells. *Acinetobacter baylyi* ADP1 is naturally transformable, readily editing its chromosomal DNA, which makes it a convenient chassis for synthetic biology. The catabolic genes for salicylate, benzoate, and catechol metabolism are located within a supraoperonic cluster (*-sal-*



are-ben-cat-) in the chromosome of *A. baylyi* ADP1, which are separately regulated by LysR-type transcriptional regulators (LTTRs). ADP1-based biosensors were constructed in which *salA*, *benA*, and *catB* were fused with a reporter gene cassette *luxCDABE* under the separate control of SalR, BenM, and CatM regulators. Salicylate, benzoate, catechol, and associated metabolites were found to mediate cross-regulation among *sal*, *ben*, and *cat* operons. A new mathematical model was developed by considering regulator-inducer binding and promoter activation as two separate steps. This model fits the experimental data well and is shown to predict cross-regulation performance.

KEYWORDS: cross-regulation, Acinetobacter baylyi ADP1, catechol, salicylate, benzoate, LysR-type gene regulation, mathematic model, repressor

O ne of the important goals of synthetic biology is to reprogram and rewire regulatory genes in innovative ways for the implementation of novel tasks. To help better design a controllable gene network, it is crucial to understand naturally occurring gene regulatory systems and develop mathematic models to predict gene regulation performance. The regulated gene transcription is an essential strategy in prokaryotes for the economic use of energy and enables a rapid response to the changing environment.

The highly naturally transformable bacterium Acinetobacter baylyi ADP1 is a convenient chassis for synthetic biology, because its chromosome is readily editable by cutting, deleting, duplicating, and inserting DNA.^{1–7} One quarter of the A. baylyi ADP1 genome is composed of five major "islands of catabolic pathways".¹ LysR-type transcriptional regulators (LTTRs) control the largest family of transcriptional gene regulation system in prokaryotes.⁸ The salicylate, benzoate, and catechol degradation pathways are located in the supercluster sal-are-ben*cat* in the chromosome of *A. baylyi* ADP1, which are controlled by LysR-type transcriptional regulators SalR, BenM, and CatM separately.^{9–12} The *salAR* is controlled by SalR, which can be activated by salicylate.¹⁰ The *benABCDE* operon is regulated by BenM, responding to both benzoate and its metabolite *cis,cis*muconate.¹³ CatM controls transcription of *catA* and the *catBCIJFD* operon and is specifically activated by *cis,cis*muconate.¹⁴ BenM and CatM are 59% identical in DNA sequence, and both respond to *cis,cis*-muconate to activate transcription.¹² It was previously found that CatM was not involved in *benA* expression.¹⁵ The upstream metabolic pathway of catechol is shown in Figure 1, together with the

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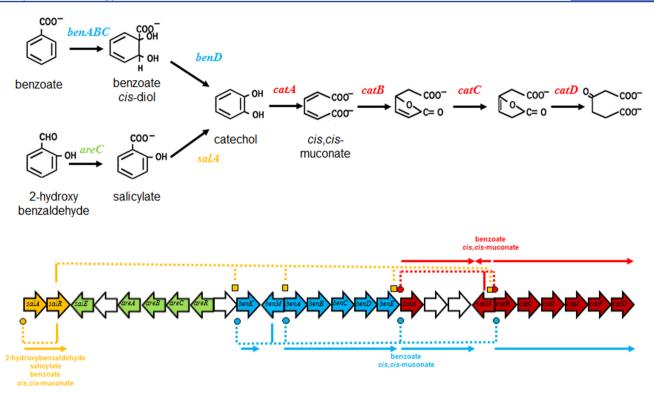


Figure 1. Metabolite pathway and gene structure of supraoperonic cluster *sal-are-ben-cat* in the chromosome of *Acinetobacter baylyi* ADP1. (gold circle) SalR activation promoter. (blue circle) BenM activation promoter. (red circle) CatM activation promoter. (orange box) SalR repression promoter.

Table 1. S	Strains and	Plasmids	Used in	This	Study
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strain	description	reference
	Acinetobacter baylyi Strains	
ADP1 (BD413)	Wild type	24
ADPWH_lux	Biosensor of salicylate. A promoterless <i>luxCDABE</i> from pSB417 was inserted between <i>salA</i> and <i>salR</i> genes in the chromosome of ADP1.	3
ADPWH_BenM	Biosensor of benzoate. A promoterless <i>luxCDABE</i> from pSB417 was inserted into <i>benA</i> gene in the chromosome of ADP1.	this study
ADPWH_CatM	Biosensor of catechol. A promoterless <i>luxCDABE</i> from pSB417 was inserted into <i>catB</i> gene in the chromosome of ADP1.	this study
ADPWH_ $\Delta SalR$	Mutant of ADPWH_lux. A 4-bp deletion was made in the chemical binding module of <i>salR</i> regulatory gene in ADPWH_lux chromosome.	4
ADPWH_CatM_ Δ SalR	Mutant of ADPWH_CatM. A 4-bp deletion was made in the chemical binding module of <i>salR</i> regulatory gene in ADPWH_CatM chromosome.	this study
	Escherichia coli Strains	
DH5 α	High efficiency competent cells.	
	Plasmid	
pGEM-T	Amp ^r , T7 and SP6 promoters, <i>lacZ</i> , vector.	
pSB417	<i>luxCDABE</i> source plasmid, The <i>luxCDABE</i> cassette was originally from <i>Photorhabdus (Xenorhabdus) luminescens</i> ATCC2999 (Hb strain).	23
pUTKm1	Source of kanamycin resistance gene.	25
pGEMT_BenMA_EB	benMA with EcoRI/BamHI (1105 bp) are inserted into pGEM-T.	this study
pGEMT_BenMA_lux	luxCDABE (5846 bp) from pSB417 was inserted at <i>Eco</i> RI site of pGEMT_BenMA_EB.	this study
pGEMT_BenMA_lux_KM	km' (1708 bp) from pUTKm1 was inserted at BamHI site of pGEMT_BenMA_lux.	this study
pGEMT_CatMB_E	catMB with EcoRI (981 bp) was inserted into pGEM-T.	this study
pGEMT_CatMB_lux	luxCDABE (5846 bp) from pSB417 was inserted at <i>Eco</i> RI site of pGEMT_CatMB_E.	this study
pGEMT_CatMB_lux_KM	km ^r (1708 bp) from pUTKm1 was inserted at BamHI site of pGEMT_CatMB_lux.	this study

gene structure of *salAR*, *catBCIJFD*, and *benABCDE* operon on the chromosome of *A. baylyi* ADP1.

Cross-regulation, which refers to either a single promoter that is activated by different molecules or different promoters that are activated by one molecule, is found among the *sal-areben-cat* cluster. In this study, SalR was found to be a repressor not only to the *salAR* operon but also to the *catBCIJFD* and *benABCDE* operons that are controlled by CatM and BenM. SalR, BenM, and CatM regulated operons were cross-regulated and activated by small molecules salicylate, benzoate, catechol, or *cis,cis*-muconate but at different transcriptional levels. Traditional mathematic models are not suitable to simulate

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Table 2. Primers Used in This Study

primer	sequence (5'-3')	note
catM-F-out	TCAGGTAACAAACCATACAGTAAGGAG	outside <i>catM</i> gene
catM-F	GGGGCGGCTGGGCAATACACAACTT	internal <i>catM</i> gene
catB-R	GCACTGTCTGGGCCAGTCAAGACCTCAT	internal <i>catB</i> gene
catMB-R	TGATGGACAACA <u>GAATTC</u> GCTTGAAATAGGTG	created <i>Eco</i> RI site
catMB-F	CACCTATTTCAAGC <u>GAATTC</u> TGTTGTCCATC	created <i>Eco</i> RI site
catB-R-out	TGCCACCATATAGACTGATTCCAGC	outside <i>catB</i> gene
benM-F-out	TTGATTAAGCGGATGGCTGGCATATA	outside <i>benM</i> gene
benM-R-out	CATCGCGCGAATGGTATCACCTGCCT	outside <i>benA</i> gene
benM-F	CCGGCATCGATACGGCCTTCTTTTAATG	internal <i>benM</i> gene
benA-R	CATCGCTTGGATCTTTCACCTTCAAC	internal <i>benA</i> gene
benMA-R	AGCCAAATAAAC <u>GGATCCGAATTC</u> CCAATTTCCTTCGAA AAT	created EcoRI and BamHI sites
benMA-F	AATTGG <u>GAATTCGGATCC</u> GTTTATTTGGCT	created EcoRI and BamHI sites
luxC-R	GAGAGTCATTCAATATTGGCAGG	internal <i>luxC</i> gene
luxE-F	TGGTTTACCAGTAGCGGCACG	internal <i>luxE</i> gene
luxE-F_2	CAGTTATCCAGCATTTATTGTTACC	internal <i>luxE</i> gene

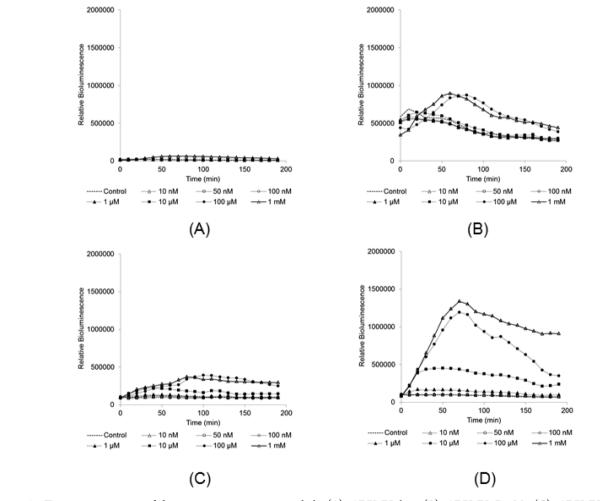


Figure 2. Time course curve of biosensor response to catechol: (A) ADPWH_lux, (B) ADPWH_BenM, (C) ADPWH_CatM, (D) ADPWH_CatM_ Δ SalR. The biosensors were induced by catechol from 0 (control) to 1 mM under the same conditions. The baselines of these 4 biosensors were different, and the baseline of ADPWH_BenM was significantly higher than those of the other three biosensors. The response of ADPWH_CatM_ Δ SalR to catechol was significantly higher than that of ADPWH_CatM.

cross regulation because they treat regulator-inducer binding and promoter activation as a single step that cannot distinguish between the different regulator-inducer interactions and transcriptional activations. We developed a new mathematical model by considering regulator-inducer binding and promoter activation as two separate steps. The new model fits the experimental results well and has been shown to predict a cross-regulation by applying the same parameters to a new gene regulation system. This model would offer a novel approach to design and optimize the gene regulation network in terms of adjusting the cross-regulation effects.

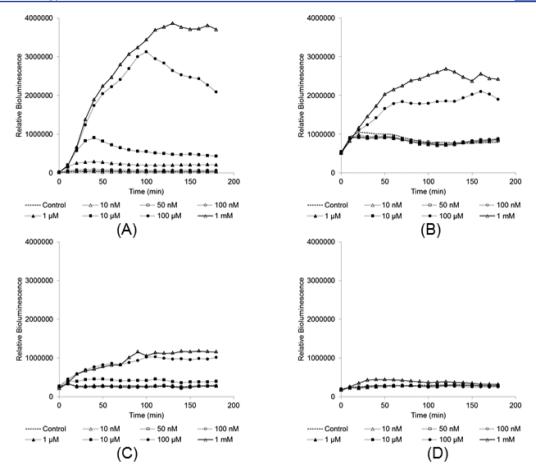


Figure 3. Time course curve of biosensors response to salicylate: (A) ADPWH_lux, (B) ADPWH_BenM, (C) ADPWH_CatM, (D) ADPWH_CatM_ Δ SalR. The biosensors were induced by salicylate from 0 (control) to 1 mM under the same conditions. ADPWH_lux showed the most sensitive and strongest response. ADPWH_CatM_ Δ SalR was silent to salicylate, indicating CatM cannot recognize salicylate to trigger the *catB* gene expression. The small induction of ADPWH_CatM_ Δ SalR when exposed to high concentrations of salicylate was due to leakage of *salA* expression, which converted salicylate into the inducer *cis,cis*-muconate.

RESULTS AND DISCUSSION

Gene Structure of BenM and CatM Regulated Biosensors. ADPWH BenM was constructed by inserting a promoterless luxCDABE cassette into the benA gene in the ADP1 chromosome, which is controlled by the BenM regulator.¹² PCR and DNA sequencing results using the primer pair benM-F-out/luxC-rev (Table 2) confirmed the location of luxCDABE on the chromosome of ADPWH BenM. Since wild type A. baylyi ADP1 cannot grow in 300 µg/mL ampicillin within 24 h, the positive growth of ADPWH BenM under this condition indicated that it contains an ampicillin-resistant gene. It suggests that the whole plasmid pBenMA_lux_KM (containing the Amp^r gene) has been integrated into the chromosome of ADPWH_BenM via Campbell-type recombination (Supplementary Figure S1A). The metabolic pathway from benzoate to cis, cis-muconate is still intact in ADPWH -BenM (Figure 1).

The *catB* is regulated by the LysR-type CatM (Figure 1).¹² ADPWH_CatM and ADPWH_CatM_ Δ SalR have been constructed by inserting a promoterless *luxCDABE* cassette into *catB* gene on the chromosome of ADP1 and ADPWH_ Δ SalR (Table 1, Supplementary Figure S1). The insertions in the chromosome in ADPWH_CatM and ADPWH_CatM_ Δ SalR were confirmed by PCR and DNA sequencing using the two primer pairs catM-F-out/luxC-rev and catB-R-out/luxE-F 2 (Table 2) (Supplementary Figure

S1B). In addition, both ADPWH_CatM and ADPWH_CatM_ Δ SalR cannot grow on LB agar supplemented with 300 μ g/mL ampicillin, suggesting the insertion has occurred via homologous recombination (Supplementary Figure S1B).

Biosensors Induced by Catechol. Three biosensors containing intact salR, namely, ADPWH CatM, ADPWH lux, and ADPWH BenM, show moderate responses to catechol (Figure 2) with the maximum response ratio of 3.84, 7.54, and 3.13 respectively in the presence of 1 mM catechol. In contrast, ADPWH CatM Δ SalR, in which salR was disrupted by a 4-bp deletion,⁴ was strongly activated by catechol (Figure 2) with a maximum response ratio of 17.46 to 1 mM catechol. It is notable that the only difference between ADPWH CatM and ADPWH CatM Δ SalR is functionality of SalR (Table 1). The strong catechol induction in ADPWH CatM Δ SalR (Figure 2) indicates that the functionality of SalR affects CatM regulatory performance. It is likely that SalR and CatM competitively bind the catB promoter and that catechol molecules will bind to CatM and trigger the expression of the catBCIJFD operon in ADPWH CatM Δ SalR where SalR is non-functional (Figure 2). The low baseline of the salAR operon expression in ADPWH_lux (Figure 2) suggests that it is tightly repressed by its regulator SalR. Indeed, a previous study on SalR mutation indicated that disruption of the DNA binding domain (DBD) of SalR increased the sal operon background expression.⁴ These results suggest that SalR, like CatM and

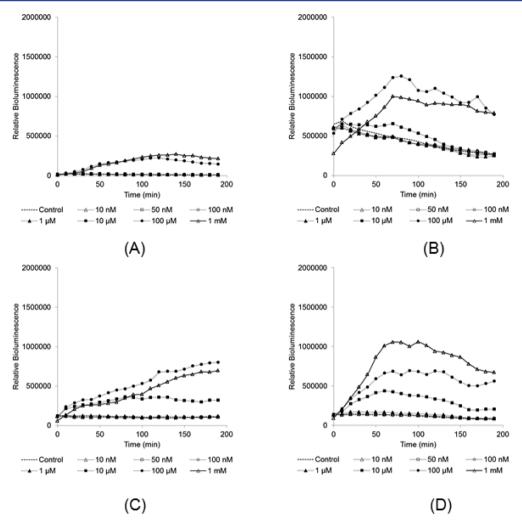


Figure 4. Time course curve of biosensors response to benzoate: (A) ADPWH_lux, (B) ADPWH_BenM, (C) ADPWH_CatM, (D) ADPWH_CatM_ Δ SalR. The biosensors were induced by benzoate from 0 (control) to 1 mM under the same conditions.

BenM,^{5,9} is also a repressor and that it not only represses the *salAR* operon but also crossly represses the expression of the *catBCIJFD* and *benABCDE* operons (Figure 2). The strong background of ADPWH_BenM (Figure 2), when compared with ADPWH_lux, ADPWH_CatM, and ADPWH_CatM_ Δ -SalR, indicates that BenM is a relatively weaker repressor than SalR and CatM.

Biosensors Induced by Salicylate. The high response of ADPWH lux to salicylate indicates that the SalR regulator senses and binds salicylate to activate the salAR promoter (Figure 3). Although ADPWH_CatM was responsive to salicylate, ADPWH CatM Δ SalR was nearly unresponsive (Figure 3). This suggests that it is salicylate metabolites (likely cis,cis-muconate as previously suggested¹⁴), but not salicylate itself, that activates the catBCIJFD operon in ADPWH CatM and the silence of ADPWH CatM Δ SalR is due to the nonfunctional salR gene that disrupts the salicylate-to- cis,cismuconate pathway. A relatively weak induction of ADPWH -CatM Δ SalR was observed when exposed to high concentrations of salicylate of 0.4-1 mM (Figure 3). It is presumed that a low level leakage of salA expression led to a small amount of conversion of salicylate into cis,cis-muconate that activated a weak expression of the catBCIJFD operon. ADPWH BenM expressed bioluminescence in the presence of salicylate since its pathways from salicylate to muconate were intact (Figure 1).

The results in Figure 3 are consistent with previous studies that suggest that a salicylate metabolite, *cis,cis*-muconate, is an inducer to BenM and CatM regulators.⁹

Biosensors Induced by Benzoate. ADPWH_lux shows a higher response to benzoate than catechol (Figures 2 and 4), suggesting that benzoate could have a more specific binding capability to the SalR regulator than catechol to trigger *luxCDABE* expression. Previous studies suggested that the response of ADPWH_BenM to benzoate was the result of the interaction between the BenM regulator and both benzoate and *cis,cis*-muconate.⁵ Since ADPWH_BenM contains an intact benzoate degradation pathway, benzoate can be converted into *cis,cis*-muconate (Figure 1), and ADPWH_BenM was thus responsive to benzoate (Figure 4).

Cross Regulation in *Acinetobacter baylyi* **ADP1.** ADPWH_ Δ SalR does not express any bioluminescence in response to salicylate, benzoate, or catechol, indicating the *salAR* operon is silenced due to disruption of the *salR* regulator gene (data not shown). As described before, the SalR regulator could compete with the CatM and BenM to suppress the expression of the *catBCIJFD* operon. Therefore, the disruption of *salR* in the ADPWH_CatM_ Δ SalR strain changes the regulator activation probability of CatM or BenM to their promoters, leading to higher gene expression rates to benzoate (9.4) and catechol (16.5) compared with those of ADPWH_-

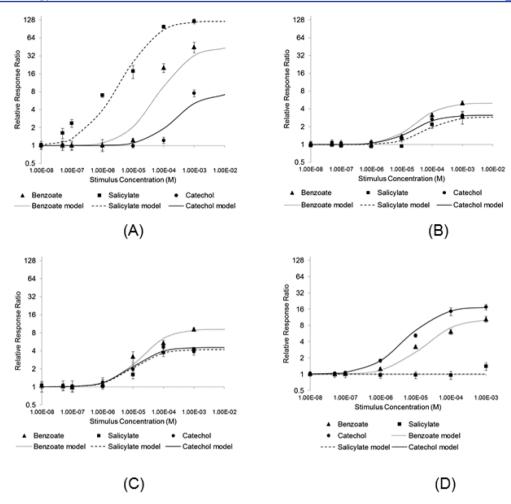


Figure 5. Match of experimental data and model predictions of relative response ratio at different inducer concentrations. (A) ADPWH_lux. (B) ADPWH_BenM. (C) ADPWH_CatM. (D) ADPWH_CatM_ Δ SalR. Dots are experimental data obtained from individual biosensor response to inducers. Lines represent the model simulation, the parameters are derived from the new regulation model, and predicted rates of gene expression and specific inducer binding rates are shown in Table 3.

Table 3. Biosenso	Respective	Response	Ratio to	Different Inducers
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		gene expression rate $(s^{-1} \cdot cell^{-1})$		special inducer binding rate K_1			
		benzoate	salicylate	catechol	benzoate	salicylate	catechol
experiment	ADPWH_lux	43.9	120.8	6.5	2632	25641	1754
	ADPWH_BenM	4.0	1.9	2.1	17241	9804	24390
	ADPWH_CatM	8.2	3.2	3.5	19231	47619	46948
	ADPWH_CatM_ Δ SalR	9.4	0.1	16.5	19608	0	48544
model	ADPWH_CatM_ Δ SalR	8.2	0.0	3.5	19231	0	46948

CatM (8.2 and 3.5, respectively), as shown by the results in Figure 5 and Table 3. Lack of competitive binding of SalR, caused the responsive sensitivity of ADPWH_CatM_ Δ SalR to catechol to be significantly enhanced, and it was able to detect catechol as low as 0.1 μ M in comparison with a 2 μ M responsive threshold in ADPWH_CatM (Figure 2). In summary, SalR is a repressor of the *salAR*, *catBCIJFD*, and *benABCDE* operons in the absence of inducer. The SalR regulator can sense both salicylate and benzoate leading to *salA* activation, while the inducer of BenM is benzoate or *cis,cis*-muconate. The *catBCIJFD* is regulated by CatM, which recognizes benzoate and *cis,cis*-muconate, and its transcription level can be enhanced by deletion of the *salR*. Silencing of the *salicylate* degradation pathway increases sensitivity of the *catBCIJFD* response to catechol.

Traditional Gene Transcription and Translation Model. *A. baylyi* ADP1 is a well-established model strain for metabolism research due to its genetics and physiological properties.¹⁶ Gene regulation has been modeled to reveal the biochemical and biophysical relationship between gene expression and metabolite pathways. In a classical theoretical analysis, a conventional chemical reaction equation is usually used to describe the processes of transcription and translation¹⁷ as shown in eqs 1–4.

$$\frac{\mathrm{d}[\mathrm{mRNA}]}{\mathrm{d}t} = \alpha_{\mathrm{m,s}} - \gamma_{\mathrm{m}} \cdot [\mathrm{mRNA}] \tag{1}$$

$$[mRNA]_{stable} = \alpha_{m} / \gamma_{m}$$
⁽²⁾

$$\frac{d[\text{protein}]}{dt} = \alpha_{p} \cdot [\text{mRNA}] - \gamma_{p} \cdot [\text{protein}]$$
(3)

$$[\text{protein}]_{\text{stable}} = \frac{\alpha_{p} \cdot [\text{mRNA}]}{\gamma_{p}} = \alpha_{\text{m,s}} \cdot \frac{\alpha_{p}}{\gamma_{p} \cdot \gamma_{\text{m}}}$$
(4)

 $\alpha_{\rm m}$ and $\gamma_{\rm m}$ represent mRNA synthesis and decay coefficient (s⁻¹·cell⁻¹), and $\alpha_{\rm p}$ and $\gamma_{\rm p}$ are protein synthesis and decay coefficient (s⁻¹·cell⁻¹). However, in this model mRNA synthesis and translation are assumed to be stable processes, and the promoter activation and inducer binding has been regarded as a single step.¹⁸ Such a simplified assumption cannot explain the stochastic gene expression (noise) that was observed at the single cell level.¹⁹

To address the problem of intrinsic and extrinsic noise in gene expression, knowing the mRNA synthesis rate is the key factor, but it is still a challenge to measure it. Normally, mRNA synthesis is defined by the classic Hill's gene regulation model as shown in eq 5.

$$\alpha_{[s]} = \alpha \cdot \frac{[S]}{\frac{k^+}{k^-} + [S]}$$
(5)

Here α (s⁻¹·cell⁻¹) represents the saturated transcription rate when a regulator combines with an inducer, and k^+ and k^- are the chemical reaction rates of the equilibrium (s⁻¹·cell⁻¹). When the number of inducers in the cytoplasm is [S] (cell⁻¹), the real transcription rate is $\alpha_{[s]}$ (s⁻¹·cell⁻¹).

New Mathematical Gene Regulation Model Developed in This Study. Usually inducer-bound regulator is not consumed, which is an assumption made in Hill's equation.²⁰ The inducer-bound regulator does not help RNA transcription until it is bound to the promoter. It is the dynamic equilibrium between inducer-bound regulator and free regulator that determines the probability of RNA transcription. Such dynamic equilibrium reaches a stable state when inducer concentration is constant.

Here we consider that the extrinsic noise comes from variation in the cellular components of the transcriptional process, such as limitations in the amount of regulatory protein and the different chemical reaction rates of the regulatory protein-inducer interaction and promoter activation of transcription.²¹ The new LysR-type gene regulation model is therefore developed in eqs 6-10.

$$[S] + [R] \leftarrow \frac{k_1}{k_1^{-1}} \rightarrow [RS] \xrightarrow{k_m} \text{gene expression}$$
(6)

$$[RS] + [R] = [R]_{total}$$
(7)

$$\frac{\mathrm{d}[\mathrm{RS}]}{\mathrm{d}t} = k_1 \cdot [\mathrm{S}] \cdot [\mathrm{R}] - k_1^{-1} [\mathrm{RS}]$$
(8)

$$[RS] = [R]_{\text{total}} \cdot \frac{[S]}{\frac{k_1^{-1}}{k_1} + [S]}$$
(9)

$$\alpha_{\rm m,s} = (k_{\rm m} \cdot [{\rm R}]_{\rm total}) \cdot \frac{[{\rm S}]}{{\rm K}_1^{-1} + [{\rm S}]} = \alpha_{\rm m} \cdot \frac{[{\rm S}]}{{\rm K}_1^{-1} + [{\rm S}]}$$
(10)

where $[R]_{total}$ (cell⁻¹) represents the total number of the limited regulatory protein, while [RS] (cell⁻¹) and [R] (cell⁻¹) refer to the proteins combined with inducers and free regulatory protein, respectively. k_1 and k_1^{-1} (s⁻¹·cell⁻¹) are

the inducer binding and disassociating rates of the equilibrium. $k_{\rm m}$ (s⁻¹·cell⁻¹) is the transcription rate when the operon is triggered by RS, and K_1 is the special inducer binding rate (non-dimensional ratio between k_1 and k_1^{-1}). $\alpha_{\rm m,s}$ (s⁻¹·cell⁻¹) and $\alpha_{\rm m}$ (s⁻¹·cell⁻¹) are the transcription rate under [S] and saturated inducer conditions, respectively. From eq 10, the new model follows a similar shape as Hill's equation but assumes two separate steps: the inducer-regulator interaction and promoter activation.

From the Hill's equation, however low the concentration of a substrate is, an induced gene expression would occur; in other words, there is no induction limit and no baseline. However, this simplified model does not fit experimental observations in reality. It is observed that gene expression usually has a non-zero baseline and an inducer-regulated transcription occurs when an inducer's concentration is greater than a threshold. The baselines vary in different gene regulation systems. For example baselines of the *catBCIJFD* and *benABCDE* operons are 100–1000 times stronger than that of the *salAR* operon (Figures 3, 4, and 5). In the new model, an expression background is introduced when inducer concentration is lower than a threshold, and it is shown in eq 11. Here $\alpha_{\rm m} \cdot ([S])/(K_1^{-1} + [S])$ (s⁻¹·cell⁻¹) is the gene expression rate when inducer concentration is [S].

$$\alpha_{[S]} = \alpha_{m[0]} + \alpha_{m} \cdot \frac{[S]}{K_{1}^{-1} + [S]}$$
(11)

where $\alpha_{m[0]}$ (s⁻¹·cell⁻¹) represents the baseline transcription rate when the cells are not exposed to the inducer (based on experimental data). Based on the experimental data obtained in this study, the respective gene expression rate $(k_{\rm m} \cdot [R]_{\rm total})$ and special inducer binding rate (K_1) of ADPWH CatM, ADPWH BenM, and ADPWH lux were calculated and are shown in Table 3. By using the same parameters obtained from the simulations of these three biosensors, the predicted performance of ADPWH CatM Δ SalR fits the experimental data well (Figure 5D). The correlation coefficients and *p*-values of the model simulation and prediction are shown in Supplementary Table S1, indicating experimental data and the model calculation matched well. It suggests that the new model is valid to simulate this LysR-type of inducer-regulated gene expression. Compared with the classical gene regulation model, the key point of this new model is to separate the two steps of the inducer-regulator interaction and promoter activation. This separation enables the new model to consider the effect of noise and suggests that the baseline is due to stochastic gene expression.

Theoretical and Mathematical Analysis of Cross Gene Regulation. On the basis of these parameters, the behavior of several different biosensors can be simulated when exposed to different concentration of inducers, as shown in Figure 5. From the results of model simulation, ADPWH_lux shows a positive response to all the inducers, but the response ratio varies within a large range. The inducer binding rates indicate that SalR can sense salicylate with high specificity while its recognition of benzoate and catechol is weak. However, the gene expression of benzoate to ADPWH_lux is high, suggesting that SalRbenzoate complex can also effectively activate *salAR*.

As for ADPWH_BenM, its special binding rate K_1 to catechol (24390) is higher than that to benzoate (17241) (Table 3), whereas the gene expression rate to catechol (2.1 s⁻¹·cell⁻¹) is lower than that to benzoate (4.0 s⁻¹·cell⁻¹). It is

suggested that the *benABCDE* is activated by *cis,cis*-muconate, a metabolite of catechol degradation, and that BenM regulator has more specificity to sense *cis,cis*-muconate than benzoate.¹² These results hint that the BenM-benzoate complex has a higher activation capability to trigger gene expression than BenM-*cis,cis*-muconate. The inducer binding rate of ADPWH______BenM to salicylate (9804) is much lower than that to catechol (24390), suggesting that salicylate can strongly suppress the *benA* gene expression. Since catechol is a metabolite of salicylate degradation and can be sensed by BenM with high specificity, salicylate must have the capability to bind BenM with a lower gene expression rate.

The special inducer binding rates of ADPWH CatM to catechol and to benzoate are 46948 and 19231, respectively (Table 3). It suggests that CatM has a high specificity to sense cis,cis-muconate but a low capability to bind benzoate, resulting in a low binding rate when exposed to benzoate. Since benzoate can be converted into catechol through the metabolite pathway, the binding rate of ADPWH CatM to benzoate is the combined effects of both catechol and benzoate. Thus, the low binding rates to benzoate suggest that CatM has a high specificity to sense catechol but a low capability to bind benzoate, resulting in low binding rate when exposed to benzoate. On the other hand, the gene expression rate of ADPWH CatM to benzoate $(8.2 \text{ s}^{-1} \cdot \text{cell}^{-1})$ is much higher than that to catechol (3.5 s^{-1} ·cell⁻¹). Since the *benM* and *catM* both have at least 16 amino acids for aromatic compound sensing and share 59% sequence identity, the regulators BenM and CatM have a similar capability to activate transcription at different locations with homoioplastic response type for benzoate and catechol.¹⁵ The similar special inducer binding rate and gene expression rate of ADPWH CatM to salicylate and catechol (Table 3) suggest that CatM cannot sense salicylate and the *catBCIJFD* operon expression by salicylate is activated by its metabolite, catechol.

Application of New Model To Predict Performance of ADPWH_CatM_ Δ SalR. From the gene expression rate and inducer binding rate analysis, the behavior of ADPWH -CatM_ Δ SalR can be predicted on the basis of parameters obtained from the other three biosensors' simulations. On comparison of ADPWH CatM Δ SalR and ADPWH CatM, the only difference is that the salicylate to catechol metabolite pathway is blocked in ADPWH CatM Δ SalR due to the disruption of SalR. Because the salicylate path is blocked and salicylate cannot be converted into catechol, ADPWH -CatM Δ SalR should be silent when salicylate is added. The disruption of SalR does not affect the benzoate or catechol pathway. Thus, ADPWH CatM Δ SalR should show a similar response as the ADPWH CatM when exposed to benzoate or catechol. However, the cross-regulation impacts are considered in the new mathematical model, where the disruption of the salR gene can significantly affect the gene expression rates of the *cat* operon due to the suppression of the SalR regulator, but showing no impact on the special inducer binding rate. Indeed, the experimental data show that ADPWH CatM Δ SalR has a similar special inducer binding rate as ADPWH CatM in response to catechol and benzoate while the gene expression rates are different (Table 3). Since benzoate can be converted into catechol through the metabolite pathway, the binding rate of ADPWH_CatM and ADPWH_CatM $\Delta SalR$ to benzoate is due to the combined effects of both catechol and benzoate. The model prediction matches well with the experimental data (Table 3).

Because of the disruption of the salR gene, ADPWH -CatM Δ SalR showed no response to salicylate. The salA gene is located upstream of the salicylate metabolic pathway and is not involved in the benzoate and catechol degradation process. Thus, the cross regulation is mainly caused by the SalR regulator. The optimization of catechol upstream can therefore be carried out through two potential approaches, internal regulator evolution and external cross regulation adjustment. The former can be achieved by promoter mutation and direct evolution of regulator protein. The latter, the adjustment of cross regulation, can be achieved by mutating regulatory proteins such as disruption of the SalR repressor in this study. Since our new mathematic model can distinguish regulatorinducer interaction and promoter activation as two separate steps, it would help in the better design of gene networks. Supplementary Figure S2 makes a theoretical prediction of gene expression strength of the *benABCDE* in ADPWH Δ SalR. The gene expression level of benA and catB operon changed due to the disruption of the regulator salR. It implies that a cross regulation can be adjusted by mutating regulators according to the new model prediction, which would offer a new approach for metabolic pathway reconstruction in synthetic biology.

MATERIALS AND METHODS

Bacteria Strains, Plasmids, Culture Media, and Chemicals. The bacterial strains and plasmids used in this study are listed in Table 1. Luria-Bertani broth (LB) and agar (LBA) (Fisher Scientific) or a minimal medium (MM) were used for bacterial cultivation. One liter of MM contains 2.5 g Na₂HPO₄, 2.5 g KH₂PO₄, 1.0 g NH₄Cl, 0.1 g MgSO₄·7H₂O, 10 μ L CaCl₂ solution (745 g/L), 10 μ L FeSO₄ solution (256 g/L), and 1 mL Bauchop & Elsden solution.²² MM-succinate (MMS) was prepared by adding 20 mM succinate (final concentration) to MM. A final concentration of 300 μ g/mL ampicillin (Amp) or 10 µg/mL kanamycin (Km) for A. baylyi ADP1 and its mutants was applied when required. A. baylyi strains were grown at 30 °C. All chemicals were purchased from Sigma-Aldrich Co., U.K. and were of analytical grade unless otherwise stated. All of the stock solutions were filter-sterilized by passing through 0.22 μ m syringe filters (Millipore Inc.).

Biosensor Construction. To investigate the behavior of the catechol upstream metabolite pathway in *Acinetobacter baylyi* ADP1, five biosensor strains, including ADPWH_lux, ADPWH_CatM, ADPWH_BenM, ADPWH_CatM_ Δ SalR, and ADPWH_ Δ SalR (Table 1), were characterized in this study. ADPWH_lux was constructed previously with a promoterless *luxCDABE* inserted between *salA* and *salR* in the chromosome of *Acinetobacter baylyi* ADP1 by homologous recombination.³ ADPWH_ Δ SalR was generated by disrupting the *salR* gene through a 4-bp deletion.⁴

Strain ADPWH_BenM was constructed following the scheme in Supplementary Figure S1A. PCR was used to create *Eco*RI and *Bam*HI sites inside *benA* gene, using the primer pairs benM-F/benMA-R and benA-R/benMA-F and a colony of ADP1 as DNA template (Supplementary Figure S1A and Table 2). Subsequently, *benMA* gene with *Eco*RI and *Bam*HI sites was generated through overlap extension PCR^{3,6} with the primer pairs benM-F/benA-R (Supplementary Figure S1A and Table 2). Plasmid pGEMT_BenMA_EB containing fragments of the *benMA* gene with *Eco*RI and *Bam*HI sites was cloned into pGEM-T (Promega, UK) as shown in Supplementary Figure S1, which belongs to a family of cloning vectors that have been

shown not to replicate in ADP1.² A promoterless *luxCDABE* from pSB417²³ was then cloned into *Eco*RI site of pGEMT_BenMA_EB to construct pGEMT_BenMA_lux, selected by positive bioluminescence signal on the agar plate (Supplementary Figure S1A). Plasmid pGEMT_BenMA_lux_KM was generated by cloning kanamycin resistant *km*^r cassette from pUTKm1 into pGEMT_BenMA_lux in *E. coli* DH5 α with 100 μ g/mL kanamycin as natural selection pressure (Supplementary Figure S1A). Recombination of pGEMT_BenMA_lux_KM with *A. baylyi* ADP1 wild type results in the replacement of *ben*MA fragments, and the transformants were identified on the basis of their ability to grow under 10 μ g/mL kanamycin, as shown in Supplementary Figure S1A.

The construction of ADPWH CatM and ADPWH -CatM Δ SalR, which are derived from the same plasmid pGEMT CatMB lux KM, followed the scheme in Supplementary Figure S1B. An EcoRI site was created by PCR in the *catB* gene using the primer pairs catM-F/catMB-R and catB-R/ catMB-F (Supplementary Figure S1B and Table 2), and the catMB gene with EcoRI site was generated through overlap extension PCR using the primer pairs catM-F/catB-R (Supplementary Figure S1B and Table 2). Plasmid pGEM-T was also used to generate plasmid pGEMT CatMB E containing catMB cassette with EcoRI. A promoterless luxCDABE was then cloned into the EcoRI site of pGEMT_CatMB_E to construct pGEMT_CatMB_lux, selected by positive bioluminescence signal (Supplementary Figure S1B). Plasmid pGEMT_CatMB_lux_KM was generated as mentioned above by cloning kmr cassette into pGEMT -CatMB lux (Supplementary Figure S1B). With pGEMT -CatMB lux KM as a donor and A. baylyi ADP1 wild type or the ADPWH_ Δ SalR as recipient, respectively, the *luxCDABE*-Km cassette was inserted into the chromosome through homologous recombination (Supplementary Figure S1B), where the transformants were selected on Luria-Bertani (LB) agar with 10 μ g/mL kanamycin.

To confirm the integration of luxCDABE into the chromosome, PCR was performed using two primers pairs benM-F-out/luxC-rev and benA-R-out/luxE-F for ADPWH_BenM, and CatM-F-out/luxC-rev and catB-R-out/luxE-F_2 for ADPWH_CatM and ADPWH_CatM_ Δ SalR (Figure S1B and Table 2). Here, the benM-F-out and benA-R-out were excluded in the vector pGEMT_BenMA_lux_KM and CatM-F-out and catB-R-out were excluded in the vector pGEMT_CatM_B_lux_KM. The PCR products were purified, cloned into pGEM-T vector, and sequenced. All the strains and plasmids used during the construction process are listed in Table1.

Cell Culture and Induction. After growing in LB medium at 30 °C overnight, *Acinetobacter* biosensor cells (10^8 CFU/mL) including ADPWH_CatM, ADPWH_lux, ADPWH_BenM, and ADPWH_CatM_ Δ SalR) were harvested by centrifugation at 3000 rpm for 10 min at 4 °C. The cell pellets were subsequently washed and resuspended in deionized water of the same volume. One milliliter of such biosensors was then transferred into 9 mL MMS solution to give biosensor stock solution.

Different inducers, including catechol (1.10 g), sodium benzoate (1.44 g), and sodium salicylate (1.60 g), were each dissolved in 10.0 mL deionized water to give stock solutions with 1.0 M final concentration. The stock solutions were subsequently diluted to give a series of final concentrations of 100 nM, 200 nM, 500 nM, 1 μ M, 2 μ M, 5 μ M, 10 μ M, 20 μ M, 500 μ M, 100 μ M, 200 μ M, 500 μ M, 1 mM, and 10 mM with

deionized water. A 180 μ L portion of biosensor stock solutions and 20 μ L of inducer solutions were added into each well of a black clear-bottom 96-well microplate (Corning Costa, USA). Three replicates were carried out for each sample, and deionized water was used as negative control of inducer.

Bioluminescence Detection and Data Analysis. The microplate was incubated at 30 °C and continuously monitored for 200 min within a Synergy 2 Multimode Microplate Reader (BioTek Instruments, Inc., USA) equipped with Gen5 analysis software. The bioluminescence and OD_{600} were measured every 10 min. Before each measurement, 30 s of vertical shaking was used for better cell suspension. Induced bioluminescence of biosensors was obtained by averaging five monitored bioluminescence data. Bioluminescence response ratio was calculated by dividing induced bioluminescence by original bioluminescence (time = 0). Relevant bioluminescence response ratio was evaluated by dividing induced bioluminescence induced bioluminescence by bioluminescence of negative control (non-induced) samples.

ASSOCIATED CONTENT

S Supporting Information

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Author Contributions

W.E.H., J.X., H.W., and L.W. designed the experiments. D.Z., Y.Z., Y.H., Y.W., Y.Z., Y.L., T.J., and J.X. performed the biosensor construction. D.Z., Y.W., and Y.Z. performed the biosensor characterization. D.Z. and Y.Z. performed the model simulation. D.Z. and W.E.H. analyzed the data. D.Z. and W.E.H. wrote the manuscript.

Notes

The authors declare no competing financial interest.

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