

# Continuous Control in Bacterial Regulatory Circuits

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Received 14 June 2004/Accepted 17 August 2004

**We show that for two well-characterized regulatory circuits in *Escherichia coli*, Tn10 tetracycline resistance and porin osmoregulation, the transcriptional outputs in individual cells are graded functions of the applied stimuli. These systems are therefore examples of naturally occurring regulatory circuits that exhibit continuous control of transcription. Surprisingly, however, we find that porin osmoregulation is open loop; i.e., the porin expression level does not feed back into the regulatory circuit. This mode of control is particularly interesting for an organism such as *E. coli*, which proliferates in diverse environments, and raises important questions regarding the biologically relevant inputs and outputs for this system.**

Cell signaling circuits, like electrical circuits, can be based on continuous or discrete control. With continuous control the system functions like a rheostat, i.e., the output is a graded function of the input or applied stimulus, whereas with discrete control the system is more akin to an on-off switch, with an output that is a steep or discontinuous function of the input. For systems under discrete control, an intermediate level of stimulus will give rise to a mixed population of cells; in some cells the regulatory circuit will be on and in others it will be off. For systems under continuous control, on the other hand, an intermediate level of stimulus will give rise to a uniform population in which all of the cells have essentially the same response. In both cases, however, the population-averaged response will have an intermediate value. For this reason, to distinguish between discrete and continuous control, one must measure or infer the stimulus-response behavior of individual cells. In both prokaryotes and eukaryotes, a number of wild-type regulatory circuits that have been analyzed at the single-cell level have been shown to exhibit discrete control (5, 9, 18, 25, 28, 34, 43, 48). In addition, modified or synthetic circuits with either discrete or continuous control have been constructed (7, 21, 27, 40). Wild-type circuits that exhibit continuous control of transcription in single cells, on the other hand, are less well studied, although recently two examples in yeast have been described (9, 37). Here we describe two different regulatory circuits in *Escherichia coli* that are based on continuous control, Tn10 tetracycline resistance and porin osmoregulation.

The tetracycline resistance determinant derived from the transposon Tn10 is one of the best-characterized regulatory circuits (Fig. 1a) (23). The primary protein components of this system are the efflux pump TetA and the repressor TetR. The corresponding genes *tetA* and *tetR* are transcribed from divergent promoters, both of which are repressed when TetR binds operator sites on the DNA. The antibiotic tetracycline binds TetR with high affinity, which releases the repressor from the DNA and enables transcription of *tetA* and *tetR*. This in turn results in production of TetA, which pumps tetracycline out of the cell.

Porin osmoregulation is another well-studied regulatory circuit (Fig. 1b), although our understanding of this system is less

complete than that of the tetracycline resistance circuit. The porins OmpF and OmpC are homologous proteins that form pores in the outer membrane of *E. coli*. OmpF generally has higher permeability than OmpC, depending on the properties of the solute, such as size, charge, and hydrophobicity (33). The best-studied environmental condition that affects porin expression is osmolarity (38). With increasing osmolarity of the extracellular medium, OmpF levels decrease and OmpC levels increase (45). Thus, porin osmoregulation controls the ratio of OmpC expression to OmpF expression. The key part of the network controlling this differential regulation of *ompF* and *ompC* transcription is the two-component signaling system consisting of the histidine kinase EnvZ and the response regulator OmpR (Fig. 1b) (16, 26, 45). Although EnvZ is often referred to as an osmosensor, the signal that stimulates this histidine kinase has not been determined, and there is evidence that a variety of environmental factors contribute to porin regulation (20, 29, 38).

Discrete control tends to render circuits insensitive to environmental perturbations so long as they operate far from the threshold for switching (32, 46). In contrast, systems based on continuous control generally employ negative feedback to ensure that the appropriate output level is attained (11, 14, 41, 42). Such systems are referred to as closed loop, whereas systems that lack feedback from the output are referred to as open loop. It is well known in both engineering and physiology that open-loop circuits tend to be susceptible to variations in the environment and have difficulty maintaining homeostatic control (14, 42). For the tetracycline resistance system we show explicitly that the circuit is closed loop. In addition, an open-loop version provides an example of the loss of homeostatic control described above. For the porin osmoregulatory system, on the other hand, we find the surprising result that the wild-type circuit is open loop.

## MATERIALS AND METHODS

**Cell growth.** Cells were grown aerobically at 37°C in minimal A medium (31) with 0.2% (vol/vol) glycerol, or in Luria-Bertani (LB) broth (31), as noted. Additional supplements, sucrose, tetracycline, ampicillin, and isopropyl- $\beta$ -D-thiogalactoside (IPTG), were added when appropriate as noted below.

**Plasmid and strain construction.** The strains and plasmids used in this study are listed in Table 1. MDG147 is a fluorescent reporter strain derived from MG1655 (4) that contains chromosomal operon fusions of *cfp* with *ompC* and *yfp*

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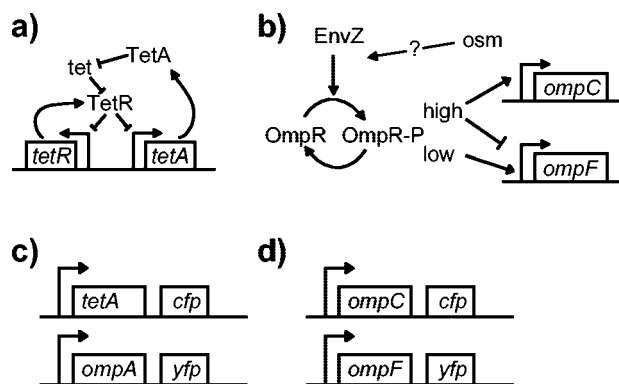


FIG. 1. (a) The Tn10 tetracycline resistance circuit. (b) The porin osmoregulatory circuit. (c, d) To measure transcription in single cells, strains were constructed in which operon fusions of *tetA* with *cfp* and *ompA* with *yfp* (c) or *ompC* with *cfp* and *ompF* with *yfp* (d) were integrated into the chromosome.

with *ompF* and was constructed in a manner similar to that for MDG131 (6). To create an in-frame deletion in *ompC*, the plasmid pMG35 (6) was digested with PshAI and religated. This removes 537 bp from the middle of *ompC*. The resulting plasmid was then used to construct EPB16 [MC4100  $\Phi(\Delta ompC\text{-}cfp^+)$   $\Phi(ompF^+\text{-}yfp^+)$ ] by homologous recombination as described previously (6). To construct an in-frame deletion in *ompF*, the primers 5'-TGAGGGTAATAAAA TAATGATGAAGCGCAATATTCTGGTGTAGGCTGGAGCTGCCTC-3' and 5'-CTGGTAAACGATACCCACAGCAACGGTGTCTGCTGACATATG AATATCCTCCTAG-3' were used to amplify the chloramphenicol resistance cassette from pKD3 (12). This PCR product was introduced into MDG147 by following the protocols described in reference 12 and then introduced into a clean MDG147 background by P1 transduction. The chloramphenicol resistance cassette, which is flanked by FRT sites, was removed by using the FLP-recombinase-expressing plasmid pCP20 (followed by plasmid curing by growth at 42°C) as described previously (12). This resulted in EPB24 [MG1655  $\Phi(ompC^+\text{-}cfp^+)$   $\Phi(\Delta ompF\text{-}yfp^+)$ ].

To construct the OmpC expression plasmid pEB19, the *ompC* gene was isolated by PCR from MC4100 genomic DNA using the primers 5'-AAAGTTAA AGTACTGTCCCTCC-3' and 5'-CGGGATCCATCGAGATTAGAAGCTGGT AA-3'. The underlined bases introduce a BamHI site. This fragment was cloned into pTrc99a (3), which had been digested with NcoI, polished with T4 DNA polymerase, and then digested with BamHI.

A fluorescent reporter of *ompA* transcription was constructed by assembling a cassette containing the last ~1 kb of *ompA*, followed by a promoterless *yfp* with a ribosome binding site, followed by ~1 kb of the DNA downstream from *ompA*. The site of insertion of *yfp* is between the *ompA* stop codon and the *ompA* transcription terminator. This cassette was cloned into pCVD442 (15), and the resulting plasmid was introduced into MC4100 by electroporation. Cells were selected for ampicillin resistance followed by sucrose resistance as described in reference 6. The resulting strain, EPB2 [MC4100  $\Phi(ompA^+\text{-}yfp^+)$ ], contains a chromosomal operon fusion of *yfp* to *ompA* at the wild-type *ompA* locus in the genome.

To construct an operon fusion between *tetA* and *cfp*, a segment containing *tetR* and *tetA* was isolated by PCR from XL1-Blue [F' Tn10] genomic DNA (Stratagene, La Jolla, Calif.) with primers 5'-CGTTGGATCCGCATTATTTTCGC-3' and 5'-GAGGGTACCTATATTTTCGCGGAATAAC-3'. The underlined bases introduce BamHI and KpnI sites, respectively. This fragment was cloned into pTM5 (Goulian lab stock), which is derived from the vector pCAH63 (22) and contains a promoterless *cfp* (and ribosome binding site) in place of the synthetic promoter and *uidAf* gene in pCAH63. The resulting plasmid, pMG53, was integrated into the chromosome of EPB2 at the phage lambda attachment site *attL* and verified to be in single copy by following the protocols in reference 22. This resulted in MDG149, which has the genotype MC4100  $\Phi(ompA^+\text{-}yfp^+)$  *attL::pMG53* [*tetR*<sup>+</sup>  $\Phi(tetA^+\text{-}cfp^+)$ ]. To construct a strain with an in-frame deletion in *tetA*, pMG53 was digested with AgeI and XmnI. The large fragment was polished with T4 DNA polymerase and ligated to give pMG56. This removes 645 bp from the middle of *tetA*. The plasmid pMG56 was then integrated into EPB2 in the same manner as was done for pMG53, resulting in MDG150, which has the genotype MC4100  $\Phi(ompA^+\text{-}yfp^+)$  *attL::pMG56* [*tetR*<sup>+</sup>  $\Phi(\Delta tetA\text{-}cfp^+)$ ].

**Analysis of single cells.** For analysis of porin regulation, colonies were inoculated into 2 ml of minimal A medium supplemented with glycerol and various

sucrose concentrations and grown to an optical density at 600 nm (OD<sub>600</sub>) of ~0.1. The cultures were then diluted 1:500 into fresh prewarmed medium. When the cultures reached an OD<sub>600</sub> of ~0.2, 100  $\mu$ g of chloramphenicol/ml was added, and the cultures were rapidly cooled in an ice-water slurry.

Similarly, for single-cell analysis of MDG149 and MDG150, single colonies were inoculated into 2 ml of minimal A glucose medium with 0.1% (wt/vol) Vitamin Assay Casamino Acids (Difco) or LB that was supplemented with various concentrations of tetracycline. Cultures were grown overnight to saturation and then diluted 1:1,000 into fresh prewarmed medium and grown to an OD<sub>600</sub> of ~0.5. After 30  $\mu$ g of streptomycin/ml was added, the cultures were chilled on ice. To eliminate autofluorescence from the growth medium, the cultures were centrifuged at 5,000  $\times$  g for 2 min, and the pellets were resuspended in phosphate-buffered saline (PBS) containing 30  $\mu$ g of streptomycin/ml. For analysis of growth on solid media, cells were streaked on LB or minimal A glycerol plates containing 1.5% agar and 50 ng or 12  $\mu$ g of tetracycline/ml and grown overnight. The next day, single colonies were picked from the plates, resuspended in 100  $\mu$ l of PBS containing 3  $\mu$ g of streptomycin, and cooled on ice.

**Fluorescence measurements.** For microscopy, cells were immobilized on glass number 1.5 coverslips with agarose pads. Approximately 50  $\mu$ l of molten 1% agarose in PBS was deposited on a microscope slide, and a coverslip was immediately applied. When the agarose had hardened, the coverslip was carefully removed, leaving a thin pad of agarose on the slide. Ten microliters of a bacterial culture was then deposited on a fresh coverslip, and the microscope slide and pad were placed on top with the agarose facing down so that the culture was spread between the pad and coverslip. Fluorescence microscopy was performed on a Zeiss Standard microscope with a 2FL fluorescence adaptor, a 100 W mercury lamp, and a Nikon 60X PlanApo NA 1.4 objective lens. Fluorescence filter sets were D436/20 excitation, 455dclp beam splitter, and D480/40 emission for cyan fluorescent protein (CFP) and HQ500/20 excitation, Q515lp beam splitter, and HQ535/30 emission for yellow fluorescent protein (YFP) (Chroma, Brattleboro, Vt.). Images were acquired with a Hamamatsu (Bridgewater, N.J.) C4742-95 cooled charged coupled device camera and analyzed using our own software, which was written in the G programming language (National Instruments, Austin, Tex.) using IMAQ Vision libraries (National Instruments).

To identify bacteria and quantify cellular fluorescence we used an image erosion method. Briefly, the images taken with the CFP and YFP filters were added together. The summed image was then converted to a binary image by setting all pixel values above a threshold level to 1 and setting the remaining pixels to zero. This was repeated for the full range of possible thresholds, and the number of particles (connected regions with nonzero pixels) was determined as a function of the threshold value. A plateau, i.e., a range of thresholds for which the number of particles does not change, indicates a level of erosion such that the

TABLE 1. Strains and plasmids used in this study

Strain or plasmid	Relevant genotype	Source or reference
<b>Strains</b>		
MC4100	F <sup>-</sup> <i>araD139</i> $\Delta(\argF\text{-}lac)169$ $\lambda^-$ <i>flhD5301</i>	10
	<i>fruA25</i> <i>relA1</i> <i>rpsL150</i> (Str <sup>r</sup> ) <i>rbsR22</i>	
	<i>deoC1</i>	
MG1655	$\lambda^-$ <i>rph-1</i>	<i>E. coli</i> Genetic Stock Center, CGSC no. 7740
MDG131	MC4100 $\Phi(ompF^+\text{-}yfp^+)$ $\Phi(ompC^+\text{-}cfp^+)$	6
MDG147	MG1655 $\Phi(ompF^+\text{-}yfp^+)$ $\Phi(ompC^+\text{-}cfp^+)$	This study
EPB16	MC4100 $\Phi(ompF^+\text{-}yfp^+)$ $\Phi(\Delta ompC\text{-}cfp^+)$	This study
EPB2	MC4100 $\Phi(ompA^+\text{-}yfp^+)$	This study
EPB24	MG1655 $\Phi(\Delta ompF\text{-}yfp^+)$ $\Phi(ompC^+\text{-}cfp^+)$	This study
MDG149	MC4100 $\Phi(ompA^+\text{-}yfp^+)$ <i>attL::pMG53</i> [ <i>tetR</i> <sup>+</sup> $\Phi(tetA^+\text{-}cfp^+)$ ]	This study
MDG150	MC4100 $\Phi(ompA^+\text{-}yfp^+)$ <i>attL::pMG56</i> [ <i>tetR</i> <sup>+</sup> $\Phi(\Delta tetA\text{-}cfp^+)$ ]	This study
XL1-Blue	[F' Tn10]	Stratagene
<b>Plasmids</b>		
pTrc99a	<i>lacI</i> <sup>q</sup> <i>P<sub>trc</sub></i> -MCS <i>bla</i>	3
pEB19	pTrc99a <i>P<sub>trc</sub></i> - <i>ompC</i>	This study
pCAH63	<i>oriR<sub>λ</sub></i> <i>cat</i> <i>attP<sub>λ</sub></i> <i>P<sub>synr</sub></i> - <i>uidAf</i>	22
pTM5	pCAH63 $\Delta(P_{synr}\text{-}uidAf)$ <i>cfp</i>	Goulian lab stock
pMG53	pTM5 <i>tetR</i> <sup>+</sup> $\Phi(tetA^+\text{-}cfp^+)$	This study
pMG56	pTM5 <i>tetR</i> <sup>+</sup> $\Phi(\Delta tetA\text{-}cfp^+)$	This study

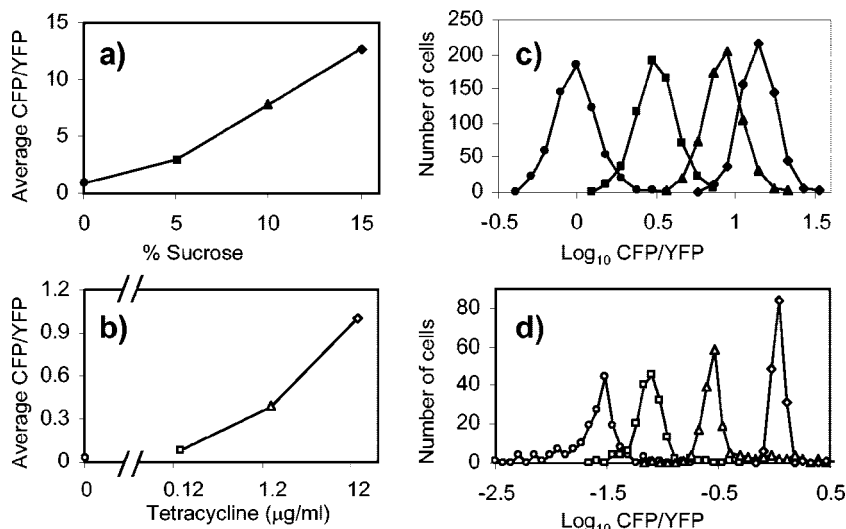


FIG. 2. Histograms of cellular CFP/YFP fluorescence of cultures with varying osmolarity (a, c) or varying tetracycline concentration (b, d). The values in panels a and b are the averages of the corresponding values from the histograms in panels c and d. *E. coli* cells were MDG131 (a, c) and MDG149 (b, d). Cultures were grown in minimal glycerol medium supplemented with 0 (●), 5 (■), 10 (▲), or 15% (◆) sucrose (a, c) or 0 (○), 0.12 (□), 1.2 (△), or 12.0  $\mu\text{g}$  (◇) of tetracycline/ml (b, d). For 0  $\mu\text{g}$  of tetracycline/ml, the CFP fluorescence was so low that the signal was dominated by cellular autofluorescence (data not shown). The scale for fluorescence measurements in the CFP and YFP channels is arbitrary.

identified particles in the image correspond to cells. The binary image constructed from the lowest threshold value in this interval was then used as a mask to identify cells. Using this mask, integrated CFP and YFP intensities for each cell were extracted from the original (unthresholded) images. The inverse mask was used to determine the average background levels for the CFP and YFP images, which were used for background subtraction.

**Analysis of porin deletion strains.** Two milliliters of minimal A glycerol medium supplemented with 0, 5, or 15% sucrose was inoculated and grown aerobically at 37°C overnight. For fluorescence measurements, the saturated cultures were then diluted 1:200 into 2 ml of fresh prewarmed medium. When the cultures reached an  $\text{OD}_{600}$  of  $\sim 0.2$ , chloramphenicol was added to 100  $\mu\text{g}/\text{ml}$ , and the cultures were rapidly cooled as described above. CFP and YFP fluorescence levels were measured with a fluorometer as described in reference 6. To measure OmpC and OmpF protein levels, the saturated cultures were diluted 1:200 into 7 ml of fresh prewarmed medium and grown to an OD of  $\sim 0.2$ . Pelleted cultures were separated by urea-sodium dodecyl sulfate-polyacrylamide gel electrophoresis as described in reference 6 and analyzed by Western blotting using antibodies that cross-react with OmpC, OmpF, and OmpA. Blots were visualized with alkaline phosphatase-conjugated secondary antibodies as described in reference 6 and digitized on a flatbed scanner with a number 12 Wratten filter (Kodak, Rochester, N.Y.) placed between the blot and the scanner.

**Analysis of OmpC overexpression.** Two milliliters of minimal A glycerol medium supplemented with 5% sucrose, 50  $\mu\text{g}$  of ampicillin/ml, and the appropriate level of IPTG was inoculated with MDG131/pEB19 or MDG131/pTrc99a and grown aerobically at 37°C to saturation. Cultures were then diluted 1:200 into 7 ml of fresh prewarmed medium and grown to an OD of  $\sim 0.2$ . At this time, 100  $\mu\text{g}$  of chloramphenicol/ml was added, and the cultures were rapidly cooled as described above. Two milliliters of the cultures was used to measure CFP and YFP fluorescence with a fluorometer as described in reference 6. The remainders of the cultures were used to quantify OmpC protein levels from cell envelopes by urea-sodium dodecyl sulfate-polyacrylamide gel electrophoresis followed by Coomassie staining as described in reference 6.

## RESULTS

**Continuous transcriptional control in the porin osmoregulation and tetracycline resistance circuits.** To measure the transcriptional output of the porin osmoregulation and tetracycline resistance systems in single cells, we have constructed two-color fluorescence reporter strains in which the genes for cyan fluorescent protein (*cfp*) and yellow fluorescent protein (*yfp*) were integrated into the chromosome as operon fusions (Fig. 1c and

d). For the porin osmoregulatory system, *cfp* and *yfp* were integrated downstream of *ompC* and *ompF*, respectively, at the wild-type loci (6). Similarly, for the tetracycline resistance system *cfp* was integrated into the chromosome downstream of *tetA* (in a strain containing a chromosomal copy of *tetR* and *tetA*), and *yfp* was integrated downstream of *ompA*, which codes for an outer membrane structural protein. The YFP fluorescence from *ompA* transcription provides a convenient normalization when quantifying CFP from the *tetA-cfp* fusion.

These operon fusions allow rapid and precise measurements of transcriptional activity in whole cultures by use of a fluorometer or in single cells by use of a fluorescence microscope. Since CFP and YFP are expressed in the same cell, the ratio of the corresponding fluorescence signals provides a sensitive measure of the relative transcription of *ompC* to *ompF* or of *tetA* to *ompA*. This ratio is insensitive to factors affecting the total protein content within the cell and also to various sources of variability in fluorescence measurements. The precision of the fluorescence measurements is evident from the small error bars (many of which are smaller than the data symbols) in the figures.

Using the above strains we measured the CFP and YFP fluorescence levels of individual cells for the cultures at several different levels of stimulus (osmolarity or tetracycline concentration). Transcription of *ompA* was unaffected by levels of tetracycline that did not inhibit cell growth (data not shown). As expected, in both cases the population-averaged response was a graded function of the applied stimulus (Fig. 2a and b). However, we also found that this behavior was reflected in the responses of individual cells. For each growth condition, the distribution of CFP/YFP fluorescence for the population of cells has an approximate Gaussian profile, indicating that, with some deviation about the mean, all of the cells in the culture exhibit essentially the same response (Fig. 2c and d). The standard deviation of the distribution presumably reflects a combination of fluctuations in gene expression (8, 17, 36) and errors in the measurements of cellular fluorescence. We con-

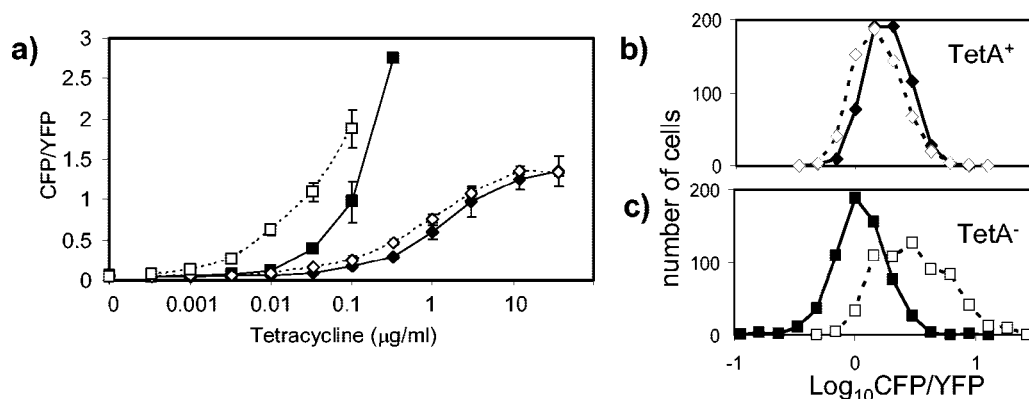


FIG. 3. (a) Transcription from the *tetA* promoter in MDG150 (TetA<sup>-</sup>) and MDG149 (TetA<sup>+</sup>) cells in response to tetracycline in rich and minimal media; MDG150 in LB (■), MDG150 in minimal A glucose medium plus Casamino Acids (□), MDG149 in LB (◆), and MDG149 in minimal A glucose medium plus Casamino Acids (◇). The growth rates were identical for all samples grown in minimal medium. The growth rates for cells grown in LB were identical except for MDG150 in the presence of 333 μg of tetracycline/ml (the highest concentration of tetracycline shown for MDG150), which exhibited a decreased growth rate. Each measurement was the average fluorescence ratio of at least 100 cells. The CFP/YFP values shown are the averages of results from at least three independent experiments, and the error bars are the corresponding standard deviations (the error bars are smaller than the data symbols in some cases). (b) The distributions of cellular CFP/YFP fluorescence are similar for MDG149 (TetA<sup>+</sup>) colonies growing on minimal glycerol agar with 12 μg of tetracycline/ml (◇) and on LB agar with 12 μg of tetracycline/ml (◆). (c) The distribution of cellular CFP/YFP fluorescence for MDG150 (TetA<sup>-</sup>) colonies growing on minimal glycerol agar with 50 ng of tetracycline/ml (□) is broader than for growth on LB agar with 50 ng of tetracycline/ml (■). Higher levels of tetracycline were used for MDG149 in order to obtain average levels of fluorescence that were comparable to the levels seen for MDG150.

clude that for both tetracycline resistance and porin osmoregulation, cells make use of continuous control; as the stimulus is varied, cells do not exhibit a discontinuous switch-like change in transcription but instead show a continuous or graded response.

**Closed-loop control in the tetracycline resistance circuit.** As discussed above, regulatory circuits based on continuous control generally make use of negative feedback to attain the appropriate output level and maintain homeostasis. It is thus natural to ask whether the above systems are closed or open loop—that is, whether or not there is negative feedback from the outputs back into the regulatory circuits. To test this for the tetracycline resistance circuit, we constructed a strain in which *tetA* was disrupted with an in-frame deletion that is not polar on the downstream *cfp* gene. We then compared CFP/YFP fluorescence as a function of tetracycline concentration in the growth medium for TetA<sup>-</sup> and TetA<sup>+</sup> (wild-type) cells. Tetracycline concentrations up to 100 ng/ml did not affect the growth rates of TetA<sup>-</sup> cells (data not shown). We found that under inducing conditions, the CFP fluorescence was greater in TetA<sup>-</sup> cells than in TetA<sup>+</sup> cells (Fig. 3a). These results indicate that there is negative feedback from TetA when tetracycline is present, i.e., the circuit is closed loop, as would be expected from the model shown in Fig. 1a. An increase in production of the efflux pump TetA will result in a drop in intracellular levels of tetracycline, which in turn leads to a drop in induction of the *tetA* promoter and hence a drop in production of TetA. In the TetA<sup>-</sup> cells the feedback loop has been disrupted (i.e., the circuit is open loop), resulting in increased intracellular levels of tetracycline and hence increased induction of the *tetA* promoter.

We can also see the effect of loss of negative feedback on homeostatic control. For a given concentration of tetracycline, *tetA* transcription in the TetA<sup>-</sup> strain was higher in minimal A glucose medium than in LB medium (Fig. 3a). In contrast, *tetA*

transcription in the TetA<sup>+</sup> strain was comparable in the two media (Fig. 3a). We also examined the distribution of cellular fluorescence for colonies growing on solid media, i.e., minimal A glycerol agar plates or LB agar plates. While the strain with the closed-loop (TetA<sup>+</sup>) circuit showed similar distributions for growth on the two types of agar (Fig. 3b), the strain with the open-loop (TetA<sup>-</sup>) circuit showed greater cell-to-cell variability in *tetA* transcription for growth on minimal A glycerol agar than for growth on LB agar (Fig. 3c). Presumably this variability arises because the open-loop circuit is sensitive to conditions that vary within the microenvironment of bacterial colonies on minimal agar plates. Regardless of the underlying physiological mechanisms that cause the variability in *tetA* transcription described above for the open-loop (TetA<sup>-</sup>) circuit, it is clear that the closed-loop (TetA<sup>+</sup>) circuit is able to maintain homeostatic control in these differing environments.

**Open-loop control in the porin osmoregulatory circuit.** From the results of previous studies, there was reason to suspect that porin osmoregulation was open loop. Promoter swap (30) and *OmpF* overexpression (39) experiments were consistent, at least qualitatively, with the absence of feedback. In addition, transcriptional reporter strains in which either *ompC* or *ompF* was disrupted with an insertion of *lacZ* showed osmoregulation of beta-galactosidase activity (44). However, the conclusions from other studies of *ompF* deletions were less clear (35, 39). We therefore wanted to check more quantitatively whether there was negative feedback from the output of this circuit.

The porin osmoregulatory circuit controls the ratio of *OmpC* expression to *OmpF* expression. To determine whether there is feedback, we looked at the effect of perturbing this ratio by perturbing the *OmpC* and *OmpF* expression levels. The porins are under complex control, and such perturbations may well affect many aspects of the network controlling porin expression. However, we are specifically looking at the question of feedback into the circuit controlling porin osmoregulation. For



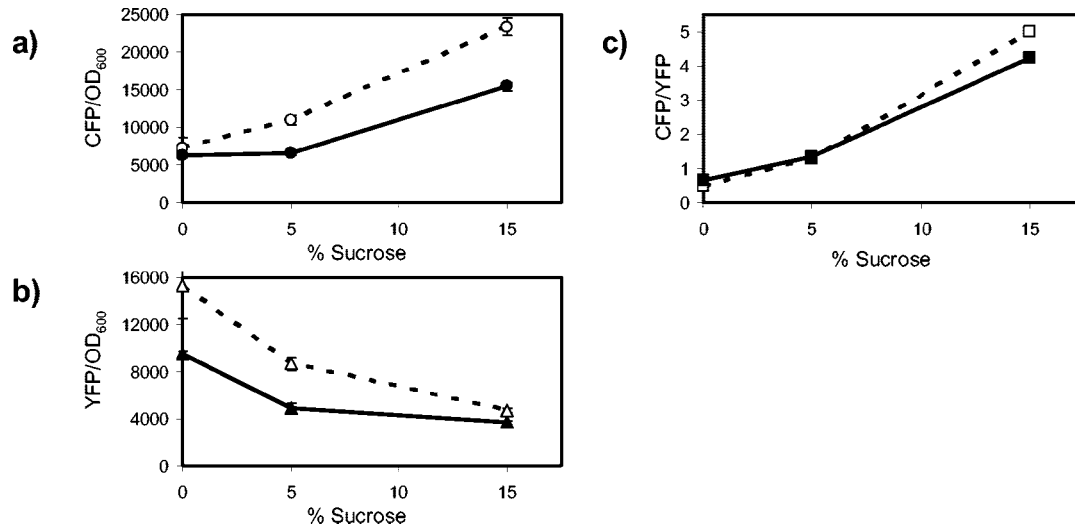


FIG. 4. Effect of in-frame deletions in *ompC* on *ompC* and *ompF* transcription. Open symbols, MDG131 (OmpC<sup>+</sup>); filled symbols, EPB16 (OmpC<sup>-</sup>). (a) CFP fluorescence (*ompC* transcription) normalized by culture OD<sub>600</sub>. (b) YFP fluorescence (*ompF* transcription) normalized by OD<sub>600</sub>. (c) The ratio of CFP fluorescence to YFP fluorescence. All points represent the averages of results from at least three independent experiments. The error bars, which denote the corresponding standard deviations, are smaller than the data symbols in most cases.

this reason, we are only interested in responses to the above perturbations that affect the relative expression of the two porins. Disruption of *ompC* will lower the ratio of OmpC expression to OmpF expression (i.e., the ratio will be set to zero). If there is negative feedback, the osmoregulatory circuit will respond by attempting to increase the ratio, either by increasing *ompC* expression, decreasing *ompF* expression, or both. This response should be stronger under conditions where the wild-type system (with a functional copy of *ompC*) has a higher ratio of OmpC expression to OmpF expression, i.e., at high osmolarity. Disruption of OmpF, on the other hand, will cause the circuit to try to lower the ratio, i.e., by trying to decrease *ompC* expression, increase *ompF* expression, or both, and this response should be stronger at low osmolarity, where OmpF is the more abundant porin in the wild-type system. Similarly, overexpression of OmpC (from a separately controllable promoter) should affect the osmoregulatory circuit in a manner that is qualitatively similar to disruption of *ompF*, since both perturbations increase the ratio of OmpC expression to OmpF expression.

To disrupt porin expression, we constructed two-color fluorescent reporter strains with in-frame deletions in either *ompC* or *ompF* that are not polar on *cfp* or *yfp*, respectively. The OmpC<sup>-</sup> strain, compared with the OmpC<sup>+</sup> strain, showed a drop in both *ompC* and *ompF* transcription (Fig. 4a and b). However, the ratio of transcription of *ompC* to transcription of *ompF* showed no difference between the two strains for growth at low and intermediate osmolarities and showed only a small decrease at high osmolarity (Fig. 4c). Thus, loss of OmpC expression does not feed back into the porin osmoregulatory circuit.

For the OmpF<sup>-</sup> strain, *ompC* transcription decreased slightly at high osmolarity compared with that for the OmpF<sup>+</sup> strain (Fig. 5a), while *ompF* transcription decreased at low osmolarity and increased at high osmolarity (Fig. 5b). The ratio of *ompC* transcription to *ompF* transcription at high osmolarity was approximately twofold lower for the OmpF<sup>-</sup> strain than for the OmpF<sup>+</sup> strain (Fig. 5c). However, at low osmolarity the

*ompC*-to-*ompF* transcription ratio was twofold higher for the OmpF<sup>-</sup> strain (Fig. 5c, see inset for an expanded scale on the vertical axis), which is the opposite response from what would be expected with negative feedback. As discussed above, if there were negative feedback, then the strongest response to an *ompF* deletion should be at low osmolarity. Thus, while the absence of OmpF has a small effect on transcription of the porin promoters, it is not due to feedback through the porin osmoregulatory circuit.

We also increased the expression of OmpC above the wild-type level for cultures grown in intermediate osmolarity (5% sucrose [Fig. 6]). Increasing OmpC expression levels led to a decrease in transcription of both *ompC* (Fig. 6a) and *ompF* (Fig. 6b). However, there was no significant variation in the ratio of transcription of the *ompC* promoter to transcription of the *ompF* promoter except for a small increase at the highest levels of OmpC (Fig. 6c). We observed similar results for cultures grown at low and high osmolarities (0 and 15% sucrose [data not shown]). Therefore, OmpC overexpression does not feed back into the porin osmoregulatory circuit.

Measurements with transcriptional reporters cannot rule out the possibility that there is feedback at the posttranscriptional level, e.g., via control of translation or of mRNA or protein stability. We therefore also examined porin protein levels with Western blots using antibodies that cross-react with OmpF, OmpC, and OmpA. The expression level of OmpA is only weakly dependent on osmolarity and provides a convenient normalization for band quantification from multiple blots (2). We found that OmpF protein levels were unaffected by the presence or absence of OmpC (Fig. 7a), and similarly, OmpC levels were unaffected by the presence or absence of OmpF (Fig. 7b). Quantification of individual blots without normalizing by OmpA similarly showed no effect on absolute levels of OmpF or OmpC (data not shown). To check that the above results are not specific to laboratory (K-12-derived) strains of *E. coli*, we also examined the K-1 strain RS218 (1). We again found that deletion of *ompF* did not affect OmpC protein

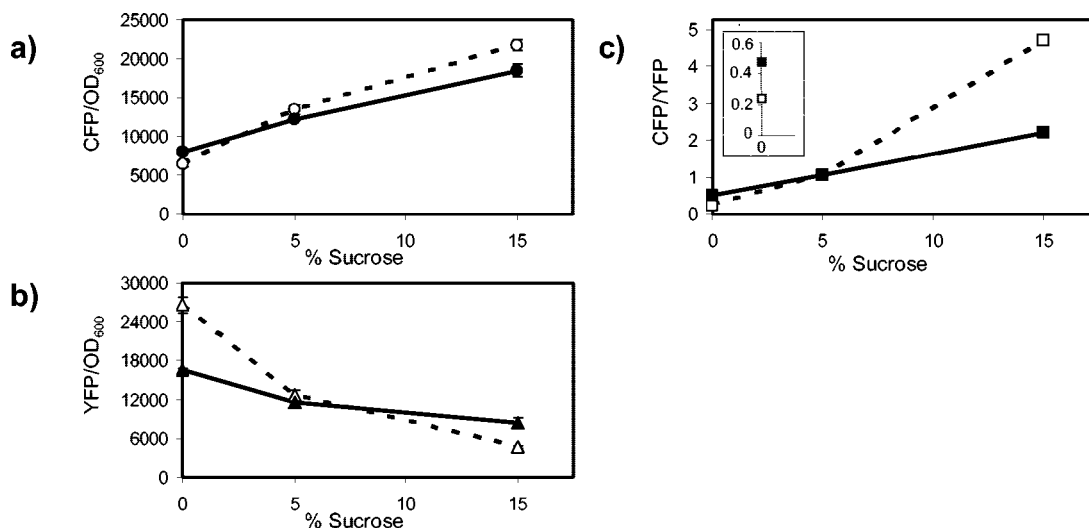


FIG. 5. Effect of in-frame deletions in *ompF* on *ompC* and *ompF* transcription. Open symbols, MDG147 (*OmpF*<sup>+</sup>); filled symbols, EPB24 (*OmpF*<sup>-</sup>). (a) CFP fluorescence (*ompC* transcription) normalized by culture OD<sub>600</sub>. (b) YFP fluorescence (*ompF* transcription) normalized by culture optical density. (c) The ratio of CFP fluorescence to YFP fluorescence. The inset in panel c displays the 0% sucrose points for MDG147 and EPB24 with an expanded scale on the y axis; see the text for a discussion. All points represent the averages of results from at least three independent experiments. The error bars, which denote the corresponding standard deviations, are smaller than the data symbols in most cases.

levels and deletion of *ompC* did not affect OmpF protein levels (data not shown). We thus conclude that the absence of OmpC or OmpF does not feed back into the porin osmoregulatory circuit at the posttranscriptional level.

Taken together, the above results imply that the expression of OmpC relative to that of OmpF does not feed back into the porin osmoregulatory circuit, and they lead to the conclusion that porin osmoregulation is under open-loop, continuous con-

trol. Unfortunately, without a closed-loop version of the circuit, we cannot explore to what extent the open-loop nature of the circuit results in environmental sensitivity for this system. However, it is worth noting that the expression of OmpC relative to that of OmpF is affected by many environmental factors in addition to osmolarity (20, 29, 38). An example can be seen in the difference in *ompC* and *ompF* transcription in strains containing ampicillin-resistant plasmids (and grown in

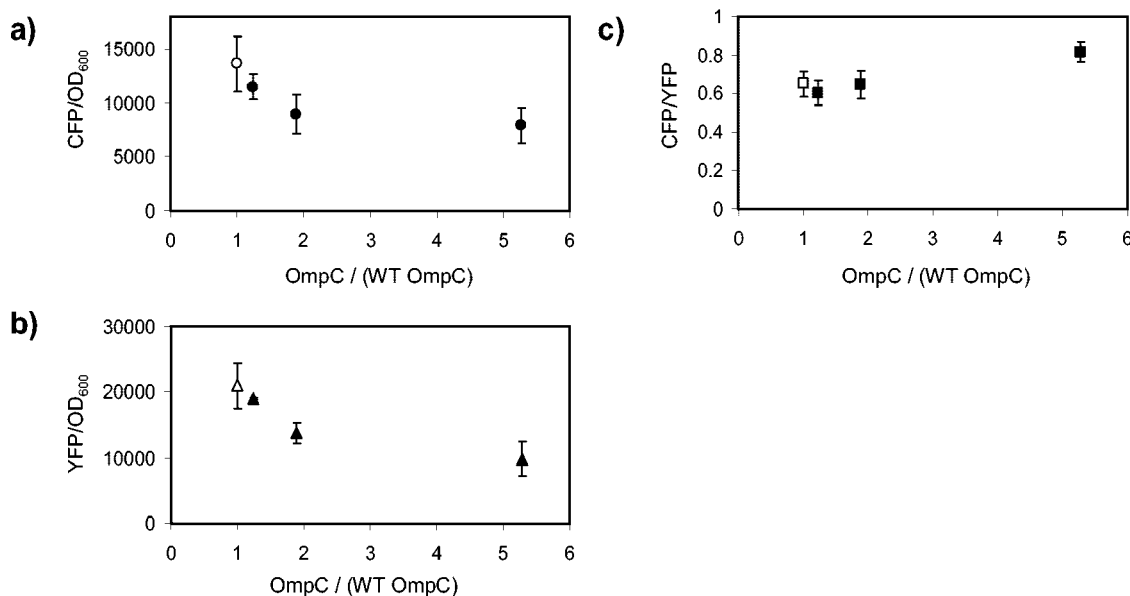


FIG. 6. Effect of OmpC overexpression on *ompC* and *ompF* transcription. Fluorescence measurements of CFP and YFP normalized by culture OD<sub>600</sub> and the corresponding fluorescence ratios for MDG131/pEB19 with various levels of IPTG induction (filled symbols). The OmpC protein level was normalized by the wild-type (WT) value, which was taken to be the OmpC level of MDG131/pTrc99a (open symbols). Cultures were grown in an intermediate-osmolarity medium (5% sucrose). Similar results were obtained for high- and low-osmolarity cultures (15 and 0% sucrose [data not shown]). The points represent the averages of results from at least three independent experiments, and the error bars denote the corresponding standard deviations.

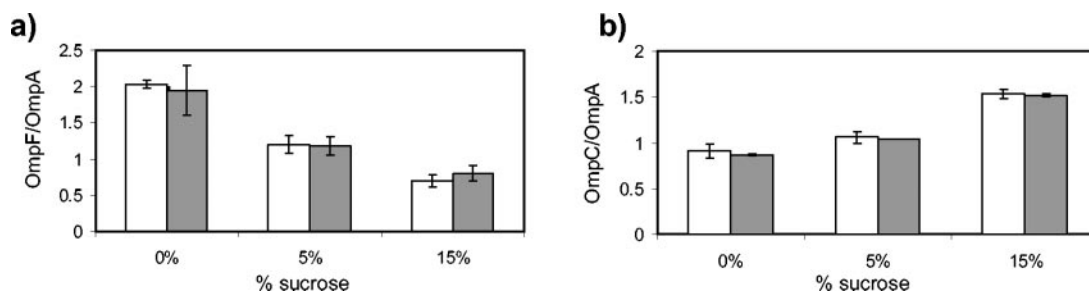


FIG. 7. Effects of an *ompC* deletion on OmpF protein levels and an *ompF* deletion on OmpC protein levels. (a) White bars, MDG131 (OmpC<sup>+</sup>); grey bars, EPB16 (OmpC<sup>-</sup>). (b) White bars, MDG147 (OmpF<sup>+</sup>); grey bars, EPB24 (OmpF<sup>-</sup>). Cultures were grown in minimal glycerol medium supplemented with the indicated concentrations of sucrose. Western blots were performed with antibodies that cross-react with both porins and with the structural protein OmpA. The data in panels a and b represent the averages of results from three and two independent measurements, respectively, and the error bars denote the corresponding standard deviations.

medium containing ampicillin) compared to that in strains without plasmids (which were grown without ampicillin): the CFP/YFP ratio for MDG131 at 5% sucrose was 1.2 (Fig. 4c), whereas the corresponding ratio for MDG131/pTrc99a was 0.65 (Fig. 6c).

## DISCUSSION

To our knowledge, our results for the tetracycline resistance and porin osmoregulation circuits are the first demonstration of continuous transcriptional control of wild-type regulatory circuits in bacteria. The fact that cells contain circuits with this form of control suggests that there is a need to adjust or tune the outputs to levels that depend on the strengths of the applied stimuli. In physiology it is generally expected that in such cases the circuits will be closed loops, i.e., there will be negative feedback from the outputs in order to ensure homeostatic control (42).

For the case of tetracycline resistance, we demonstrated explicitly that the circuit is closed loop. One can rationalize the organization of this circuit by the fact that expression of the efflux pump TetA is quite costly for cells (23). It would make sense to express the minimal amount of TetA that is necessary to lower intracellular tetracycline to tolerable levels. The tetracycline resistance circuit possesses two negative feedback loops: one mediated by TetR alone and the second mediated by TetA, tetracycline, and TetR (Fig. 1a). It has been previously demonstrated in a synthetic circuit that negative autoregulation decreases the variability in protein expression among cells (8). Since TetR represses both the *tetR* and *tetA* promoters, TetR auto-regulation presumably will decrease cell-to-cell variation not only of *tetR* transcription but also of *tetA* transcription. However, if we view the expression level of TetA as the circuit output, then TetR autorepression is an internal feedback, which does not by itself render the circuit closed loop. The TetA-mediated feedback loop, on the other hand, does make the circuit closed loop. As expected, disruption of *tetA*, which results in an open-loop version of the circuit, showed an increased susceptibility to variations in the environment, even in the presence of the internal feedback (Fig. 3).

For the case of porin osmoregulation we have shown that the circuit is open loop. Thus, there does not appear to be any mechanism for monitoring the relative expression of OmpC and OmpF and for ensuring that the appropriate ratio is achieved. It is possible that there is feedback into the porin osmoregulatory network from cellular components other than

OmpC and OmpF, e.g., from other proteins that are controlled by EnvZ and OmpR or from regulatory RNAs such as MicF (13). However, from the point of view of porin osmoregulation this would be an internal feedback loop, and the control system would still be open loop.

We used defined media and mid-log growth for our experiments so that we could more readily distinguish feedback into the porin osmoregulatory circuit from feedback into some other part of the porin regulatory network. These growth conditions show a smaller modulation of porin expression (e.g., Fig. 7 and reference 2) compared with, for example, the rich media and late-log growth that have been used in some studies. However, as is evident from the error bars in the figures, our measurements were clearly sensitive enough to detect feedback into the porin osmoregulatory system, had it been present.

The fact that porin osmoregulation is open loop suggests that cells will have difficulty regulating the relative levels of OmpC and OmpF in diverse environments. It is well known that the OmpC-to-OmpF ratio is affected by many different environmental conditions in addition to osmolarity, including pH, temperature, toxins, culture medium, and growth phase (20, 29, 38; also see the comment above regarding ampicillin). It may be that the porin regulatory network evolved to specifically respond to all of these types of stimulus. However, it is also possible that some of these responses provide no significant survival advantage or disadvantage for the bacterium and simply reflect the limited range of homeostatic control for the regulatory system.

Open-loop control of porin osmoregulation seems surprising and somewhat puzzling. How are *E. coli* cells able to set the appropriate ratio of OmpC to OmpF expression if the control circuit has no way of monitoring the ratio? It is possible that the sloppy control provided by the open-loop circuit is not sufficiently severe to be a problem for cell survival, or perhaps it even provides a survival advantage. However, this seems unlikely for an organism such as *E. coli*, which proliferates in diverse environments. Instead, it is more likely that there is a defect in our understanding of the system. In the absence of any known function of the output (the ratio of OmpC expression to OmpF expression) other than to modulate outer membrane permeability, the defect is most likely in our understanding of the circuit input.

Although there has been a substantial amount of work on the regulation of porin expression by the EnvZ/OmpR two-

component system, the role of osmolarity remains confusing. In fact, osmolarity has never seemed to be a particularly good signal for controlling the EnvZ/OmpR circuit. As discussed above, the changes in porin expression as a function of osmolarity in some growth conditions are relatively small (e.g., two- to threefold changes). Furthermore, strains with a deletion of *envZ* or with a nonphosphorylatable allele of *ompR* still show some level of osmoregulation (19, 24, 47). It is thus possible that osmolarity is not the biologically relevant input for the circuit and, in the presence of the relevant signal, the system exhibits discrete (switch-like) control or continuous control with negative feedback from the OmpC/OmpF expression level. This could occur, for example, if the true stimulus for EnvZ were a small molecule that has different permeability through OmpC and OmpF. However, a proof will require, at the very least, determining the chemical or physical stimulus to which EnvZ responds.

#### ACKNOWLEDGMENTS

We thank A. N. Binns, W. Hillen, E. Sontag, and M. van der Woude for helpful discussions.

This work was supported by NSF grant MCB0212925 (to M.G.), NIGMS grant GM65216 (to T.J.S.), and an NSF graduate fellowship (to E.B.).

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