Population heterogeneity in *Methylobacterium extorquens* AM1

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Heterogeneity of cells within exponentially growing populations was addressed in a bacterium, the facultative methylotroph Methylobacterium extorquens AM1. A transcriptional fusion between a well-characterized methanol-inducible promoter (P_{mxaF}) and gfp_{uv} was used with flow cytometry to analyse the distribution of gene expression in populations grown on either succinate or methanol, correlated with forward scatter as a measure of cell size. These cell populations were found to consist of three major subpopulations defined by cells that were actively growing and dividing, newly divided, and non-dividing. Through the use of flow cytometry, it was demonstrated that a significant percentage of the total population did not respond to carbon shift. In addition, these experiments demonstrated that a small subset of the total population was significantly brighter than the rest of the population and dominated fluorimetry data. These results were corroborated with a continuous flow-through system and laser scanning microscopy, confirming that subpopulations, not discernible in the population average, dominate population response. These results demonstrate that the combination of flow cytometry and microscopic single-cell analysis can be effectively used to determine the dynamics of subpopulations in population response. In addition, they support the concept that physiological diversity in isogenic populations can poise some proportion of the population to respond appropriately to changing conditions.

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INTRODUCTION

Historically, most prokaryotic cell biology studies have focused on data from bulk culture experiments. While this approach has been powerful in the elucidation of population dynamics and response to perturbation, the caveat of such data is that they represent averages and do not address cell-to-cell variability or the presence of physiologically distinct subpopulations. It is becoming clear that significant cell-to-cell variation in gene expression occurs in bacteria, which can result in bimodal, multimodal or Gaussian distributions within populations (Bongaerts et al., 2002; Elowitz et al., 2002; Siegele & Hu, 1997; Strovas et al., 2007), and it has been suggested that such variability might result in phenotypic differences between cells in isogenic populations (Elowitz et al., 2002; Siegele & Hu, 1997; Balaban et al., 2004; Kuang et al., 2004; Pedraza & van Oudenaarden, 2005; Rosenfeld et al., 2005). Therefore, in order to understand the response of

Abbreviation: RFU, relative fluorescence units.

populations, it is important to determine heterogeneity of key parameters within the populations and to identify significant physiologically distinct subpopulations. Such determinations require analysis at the single-cell level for comparison with population dynamics.

The drawback of single-cell studies is the difficulty of obtaining data on large numbers of cells, for large-scale population analysis. In this case, flow cytometry provides an option. However, it is also important to confirm the population-level analyses with single-cell analyses on smaller numbers of cells. Therefore, the combination of flow cytometry and high-resolution microscopy methods provides an attractive approach to characterize heterogeneity of key parameters within cell populations and assess the response of subpopulations to environmental perturbation.

The facultative methylotroph *Methylobacterium extorquens* AM1 has two strongly contrasting modes of metabolism: growth on multicarbon compounds, which is energy-

Correspondence Tim Strovas tstrovas@u.washington.edu limited, and growth on one-carbon compounds, which is limited by reducing power (Anthony, 1982; Van Dien & Lidstrom, 2002). Therefore, it is an interesting model system for studying the shift between modes of metabolism. We have previously shown by analysis of individual actively growing *M. extorquens* cells in a flow-through system that significant cell-to-cell heterogeneity exists in both gene expression and growth rate, in exponentially growing populations (Strovas *et al.*, 2007). In this study, we examined much larger cell populations via flow cytometry and obtained evidence for major subpopulations that respond differently to substrate change.

METHODS

Bacterial strains and growth conditions

M. extorquens. M. extorquens AM1 strains were grown at 28 °C in 30 ml minimal salts media (Hypho) supplemented with either 0.3 % (v/v) methanol or 0.4 % (w/v) succinate as a growth substrate (Attwood & Harder, 1972; Van Dien *et al.*, 2003). Table 1 lists the strains and plasmids used for this study. Antibiotics were added as appropriate: 50 µg rifamycin ml⁻¹ and 10 µg tetracycline ml⁻¹. The optical density (OD₆₀₀) of cultures was measured on a Beckman DU 640B spectrophotometer (1 cm path length).

Carbon shift experiments. Cultures were grown to mid-exponential phase and centrifuged at 4000 r.p.m. for 10 min at 15 °C. Cells were resuspended in minimal medium with methanol or succinate at an OD_{600} of approximately 0.2 or 0.5. At 1 h time points over a period of 26 h, 0.5 ml aliquots were taken and analysed by either flow cytometry or fluorimetry. All samples were kept at room temperature prior to analysis. For the carbon shift, cultures were

centrifuged as previously described, washed with minimal medium, and recentrifuged. The cultures were then resuspended in medium such that methanol-grown cultures were shifted to succinate or vice versa.

Construction of promoter-GFPuv transcriptional fusion insertional vectors. The P_{lac} -gf p_{uv} insertional vector, pTSG.10, was made from pCM168 and pTSGex (Marx & Lidstrom, 2004). pTSGex was constructed by inserting GFPuv via *Hind*III-*Eco*RI into pCM139, which results in the excision of P_{fae} -fae (Vorholt *et al.*, 2000). pTSG.10 was made by inserting the *PciI*-*Eco*RI P_{lac} -gf p_{uv} into pCM168 via *NcoI*-*Eco*RI. The *phaA* and *sgaA* promoters were PCR amplified and inserted into pCR2.1 to make pTS29 and pTS35r respectively. The P_{phaA} -gf p_{uv} and P_{sgaA} -gf p_{uv} insertional vectors were made by inserting the 625 bp *Bam*HI-*NsiI* P_{phaA} fragment and the ~700 bp *Bam*HI-*NsiI* P_{sgaA} fragment into pTSG.10 via *BgIII*-*Sbf*I, excising P_{lac} to make pTSG.11-2 and pTSG.12-2 respectively.

Construction of promoter-GFPuv transcriptional fusion strains. Promoter-GFPuv transcriptional fusion strains containing the fusions inserted into the *M. extorquens* AM1 *katA* chromosomal insertion site were constructed via triparental matings as previously described and screened for tetracycline resistance and kanamycin sensitivity (Marx & Lidstrom, 2004). Antibiotic markers were removed from mutants by introduction of pCM158 by triparental matings (Marx & Lidstrom, 2002). All mutants were confirmed by PCR and fluorimetry

Fluorimetry analysis. Fluorescence measurements were carried out with a Shimadzu RF-5301PC fluorimeter. GFPuv excitation was conducted at 405 nm and emissions were monitored at 509 nm. Emissions from the cells of CM174 and TSXCM174 were measured with slit widths of 5:5 and emissions from all other strains carrying promoter fusions were measured with slit widths of 10:10. Lower slit widths were used to measure P_{mxaF} activity in order to prevent the fluorescence signal from saturating the detector. Promoter activities

Table 1. M. extorquens AM1 strains and plasmids used in this study

Strain	Description	Source or reference	
AM1	Rif ^R derivative	Lab collection	
CM174	$katA::(loxP-t_{rrnB}-P_{mxaF}-gfp_{uv}-t_{T7})$	Marx & Lidstrom (2004)	
TSG.10	$katA::(loxP-t_{rrnB}-P_{lac}-gfp_{uv}-t_{T7})$	This study	
TSG.11-2	$katA::(loxP-t_{rrnB}-P_{phaA}-gfp_{uv}-t_{T7})$	This study	
TSG.12-2	$katA::(loxP-t_{rrnB}-P_{sgaA}-gfp_{uv}-t_{T7})$	This study	
TSX	Non-motile mutant ($\Delta motA$ -fliN-fliG, $\Delta motC$ -motB, $\Delta pomA$ -motB)	Strovas et al. (2007)	
TSXCM174	Non-motile mutant with $katA::(loxP-t_{rrnB}-P_{mxaF}-gfp_{uv}-t_{17})$	Strovas et al. (2007)	
Plasmid			
pGFPuv	Commercial vector	BD Biosciences (ClonTech)	
pCR2.1	PCR cloning vector	Invitrogen	
pCM139	Broad-host-range shuttle vector containing P _{fae} -fae	Vorholt et al. (2000)	
pCM157	Broad-host-range <i>cre</i> expression vector (Tet ^R)	Marx & Lidstrom (2002)	
pCM168	Insertional expression vector (t _{trrnB} -MCS-t _{T7})	Marx & Lidstrom (2004)	
pCM174	pCM168 with P_{mxaF} gfp _{uv}	Marx & Lidstrom (2004)	
pRK2073	Helper plasmid expressing IncP tra functions	Lab collection	
pTS29	pCR2.1 with P _{phaA}	This study	
pTS35r	pCR2.1 with P _{sgaA}	This study	
pTSGex	pCM139 with P_{lac} -gfp _{uv}	This study	
pTSG.10	pCM168 with P_{lac} -gfp _{uv}	This study	
pTSG.11-2	pCM168 with P_{phaA} -gfp _{uv}	This study	
pTSG.12-2	pCM168 with P_{sgaA} -gfp _{uv}	This study	

analysis.

were calculated as previously described by plotting fluorescence versus OD_{600} (Leveau & Lindow, 2001). P_{mxaF} activity was normalized to compensate for different slit-width settings based on calibration curves generated with rhodamine-123 (data not shown).

Flow cytometry analysis. Flow cytometry experiments $(n \ge 6)$ were conducted on a BD Biosciences LSR cytometer controlled by BD CellQuest Pro. Excitation was conducted with a 488 nm argon laser and fluorescence emission detected with a 530/28 nm bandpass filter in the FL1 channel. Data analysis was conducted with WinMDI 2.8 [Joseph Trotter (http://facs.scripps.edu/)], MatLab 6.5 (The MathWorks Inc.) and Excel (Microsoft).

Microscopy. Microscopy experiments were conducted on a Zeiss LSM 510 META using a 100×1.45 N.A. objective and an FCS2 flow-through cell (Bioptechs) as described previously (Strovas *et al.*, 2007).

RESULTS

Reporter validation and fluorimetry-based geneexpression analysis in bulk cultures

GFPuv is a convenient reporter of gene expression from promoters in aerobic bacteria. In order to validate GFPuv as a dynamic reporter in M. extorquens AM1, three previously characterized methylotrophy promoters were utilized and compared to results obtained with other reporters (Bongaerts et al., 2002; Albano et al., 1998; Kalyuzhnaya & Lidstrom, 2003; Lissemore et al., 2000; Marx & Lidstrom, 2001; Zhang & Lidstrom, 2003). Three new transcriptional fusion strains were constructed as chromosomal insertions in the wild-type background, in which GFPuv was transcribed from a standard P_{lac} promoter and from two native M. extorquens AM1 promoters, P_{phaA} (driving genes for poly- β -hydroxybutyrate biosynthesis; Korotkova et al., 2002) and P_{sgaA} (driving genes for the serine cycle for formaldehyde assimilation; Kalyuzhnaya & Lidstrom, 2003). These strains, along with the previously constructed P_{mxaF} -gfp_{uv} strain CM174 (Marx & Lidstrom, 2004), were used to determine the relationship between fluorescence intensity and culture optical density in cells grown on methanol and, in the case of the mxaF promoter, also cells grown on succinate. A linear relationship between relative fluorescence and cell density (OD₆₀₀) was observed for all transcriptional fusion strains, as exemplified for CM174 in Fig. 1. Promoter activities for all mutant strains were calculated as described by Leveau & Lindow (2001) and are shown in Table 2. The relative activities correlated well with those obtained previously using a xylE reporter, such that P_{lac} : xylE=32±12 nmol \min^{-1} (mg protein)⁻¹ (Marx & Lidstrom, 2001), P_{phaA}: xylE=135 mU (milliunits, Korotkova et al., 2002), P_{sgaA} : xylE=281 ± 33 mU (Kalyuzhnaya & Lidstrom, 2003), P_{mxaF} : xylE activity was $1580 \pm 210 \text{ mmol min}^{-1}$ (mg protein)⁻¹ on methanol and $1170 \pm 10 \text{ nmol min}^{-1}$ (mg protein)⁻¹ on succinate (Marx & Lidstrom, 2001).

To further validate batch culture results, the $P_{mxaF}gfp_{uv}$ fusion construct CM174 was tested in carbon shift experiments, assessing kinetics of response before and after



Fig. 1. Representative RFU versus OD_{600} plots for CM174 (containing the *mxaF-gfp* promoter fusion) grown on succinate (\blacksquare) and methanol (\blacklozenge). Means ± SD are plotted (*n*=3).

shifts to and from the inducing substrate (methanol). Cultures growing exponentially on methanol or succinate were shifted to the alternative carbon source, as described in Methods, and the intensity of GFPuv fluorescence was measured. Switching from succinate to methanol resulted in a growth lag of approximately 5 h (Fig. 2a, diamonds), consistent with previous results (Strovas et al., 2007; Marx et al., 2005). For this condition, an abrupt increase in fluorescence was observed (Fig. 2b), after which a linear correlation between fluorescence and cell density was restored, corresponding to a higher relative promoter activity (Table 2). Switching from methanol to succinate resulted in a growth lag of approximately 1 h (Fig. 2a, squares). In this case, a smaller increase in fluorescence occurred immediately after the shift, but the promoter activity remained fairly constant, with a small decrease in rate. This may be a combined result of continued high rates of transcription during the transition between methanoland succinate-growth modes, consistent with the results from flux analysis (Pedraza & van Oudenaarden, 2005), and of negligible degradation of GFPuv over time due to an in vivo half-life that is >24 h (Leveau & Lindow, 2001; Andersen et al., 1998; Zhao et al., 1999).

Flow cytometry-based analysis of population distribution in bulk cultures

Flow-cytometric analysis was employed to investigate the distribution of cells in bulk cultures in terms of relative size (estimated by forward scatter analysis) and fluorescence intensity. Forward scatter data were collected for wild-type *M. extorquens* AM1 and for the GFPuv-expressing strain CM174 at multiple time points during growth-curve experiments in batch culture. For the single-cell validation studies a non-motile mutant is necessary, to facilitate long-term observations of individual cells (Strovas *et al.*, 2007). Growth-curve and gene-expression studies were carried out

Promoter	Promoter activity (RFU OD ₆₀₀ ⁻¹ h ⁻¹)	Growth condition	n
P _{lac}	5.6 ± 0.9	Methanol	13
P_{phaA}	7.1 ± 1.7	Methanol	4
P _{sgaA}	16.0 ± 2.5	Methanol	6
P _{mxaF}	349.1 ± 82.6	Methanol	9
	264.3 ± 10.3	Succinate	6
Carbon shift activities for P _{mxaF}			
	232.3 ± 17.1	Succinate→Methanol (pre-shift)	3
	402.4 ± 28.7	Succinate→Methanol (post-shift)	3
	290.2 ± 11.2	Methanol→Succinate (pre-shift)	3
	364.5 ± 6.0	Methanol→Succinate (post-shift)	3

Table 2. Calculated promoter activities from transcriptional fusions with GFPuv in M. extorquens AM1

Activities (*P*) were calculated from $P=f_{ss} \times \mu \times (1 + \mu/m)$, where μ =growth rate, *m*=maturation half-life of GFPuv, and $f_{ss}=\Delta RFU/\Delta OD_{600}$ (Leveau & Lindow, 2001). The data represent means ± sp.

with this non-motile strain (TSXCM174) and compared to CM174, and the results for growth rate, dynamics of the growth curve and gene expression could not be distinguished between the two strains (data not shown). Therefore, further work was carried out only with the non-motile strain TSXCM174, to allow direct comparisons



Fig. 2. Dynamics of growth and gene expression for CM174 during carbon shift experiments. (a) Growth curves; (b) RFU versus OD_{600} . Arrows indicate carbon shift at 3 h (\blacksquare , methanol—succinate; \blacklozenge , succinate—methanol). Means ± sD are plotted (*n*=3).

with previously published single-cell results (Strovas *et al.*, 2007). During the exponential phase of growth on either succinate or methanol, cells exhibited lognormal distributions for both forward scatter and fluorescence emission. During the transition to stationary phase, cells from succinate-grown cultures distributed lognormally for forward scatter and fluorescence, whereas cells from methanol-grown cultures exhibited Gaussian distributions for both parameters upon the transition to stationary phase, which may reflect the specific regulation pattern for P_{mxaF} . Shifts from lognormal to Gaussian distribution were observed previously by Banerjee *et al.* (2004) using the P_{lac} -gfp system in *Escherichia coli*.

By plotting fluorescence or side scatter versus forward scatter, two subpopulations could be discerned for cultures grown on succinate or methanol (Fig. 3a, b). The subpopulation within the gated region (R1) consisted of 14-28 % of the events detected and exhibited a lognormal distribution during the exponential phase of growth (data not shown). The majority of the events detected (72-86%)were below this gated region, and these exhibited a Gaussian distribution (data not shown). Fluorescence data summed from cells that were in the $10^3 - 10^4$ RFU (relative fluorescence units) range were found to be 3-45 times greater than cells that were in the 10^{0} – 10^{3} RFU range. When methanol cultures transitioned into the stationary phase, only cells below the gated region could be detected (Fig. 4d, e), further defining the two subpopulations and suggesting that the cells below the gated region included those that were not actively growing and dividing. In succinate-grown cultures, the disappearance of cells within the gated region in stationary phase was not observed (Fig. 4b).

These data are consistent with the smaller lognormally distributed subpopulation within the region R1 representing actively growing and dividing cells, and the Gaussiandistributed subpopulation outside of region R1 representing a mixture of newly divided and non-dividing cells (cells



Fig. 3. Representative distributions during exponential growth, which exhibit two subpopulations within bulk cultures, from methanol-grown cultures. (a) Side scatter versus forward scatter, which contains an overlay of calibration data obtained from 3 μ m beads (indicated by arrow). (b) Fluorescence from the FL1 channel versus forward scatter. The R1 region in the fluorescence versus forward scatter plots was used to gate data for further analysis to gauge P_{mxaF} response.

that are not actively dividing at the time the sample was taken; Fig. 4d).

During carbon shift experiments, the switch from succinate to methanol resulted in a rapid increase in GFPuv expression, with most of the population (~ 85 %) shifting into the gated region R1 after the first hour (Fig. 5a). The remaining ~15 % of the total population did not respond to the carbon shift to methanol. Time points 0–3 h showed continued increase in GFPuv expression. Four hours after the shift to methanol as a carbon source, the resumption of growth was observed by optical density measurements and the reappearance of cells outside of region R1, presumably as a result of cell division.



Fig. 4. Side scatter versus forward scatter distributions for succinate-grown (a and b) and methanol-grown (c and d) cells in exponential phase (a and c) and stationary phase (b and d). (e) Distributions throughout a growth curve for methanol-grown cells; \blacklozenge , non-gated region; \blacksquare , gated region; \blacktriangle , OD₆₀₀. Means ± SD are plotted (*n*=12).

Cultures shifted from methanol to succinate showed a steady decline of cells within the gated region (Fig. 5b). A brief spike in GFPuv expression was observed 0–2 h after the shift to succinate.

Analysis of population heterogeneity at the single-cell level

The flow cytometry data suggested that a significant proportion of the cells in exponentially growing populations might be non-dividing, but the actual proportion cannot be determined from flow cytometry experiments, since it is not possible to follow individual cells through growth and division. Therefore, experiments were carried out to microscopically observe single cells of *M. extorquens*



Fig. 5. Fluorescence from the FL1 channel versus forward scatter for carbon shift experiments. Carbon shifts were performed 30 min prior to the 0 h time point and data were plotted on a log scale. (a) Carbon shift from succinate—methanol. (b) Carbon shift from methanol—succinate.

AM1 growing on methanol or succinate, using a flowthrough culture system and a non-motile mutant of *M*. *extorquens* AM1 (TSXCM174) (Strovas *et al.*, 2007).

As previously described (Strovas *et al.*, 2007), the cells were attached by their flagella to a poly-L-lysine-coated glass slide in the flow-through system, and were observed during multiple divisions. Daughter cells were swept away by the flow, allowing observation of division in only the originally attached cell. Cell division was observed by laser scanning microscopy, and the proportion of actively dividing cells was calculated (Table 3). In keeping with the flow

Table 3. Proportions of actively dividing cells, non-dividing cells, and dividing cells that become non-dividing for populations of *M. extorquens* AM1 grown on either succinate or methanol, as determined from microscopy experiments

Carbon	Dividing	Non-	Dividing→	Total
source		dividing	Non-dividing	cells
Succinate	44.1 %	52.0 %	3.9 %	413
Methanol	36.9 %	57.6 %	5.5 %	396

cytometry results, a significant proportion of the cells did not divide over the course of 12–30 h observation, while during this time period other cells divided multiple times. In addition, during the course of observation, a small proportion that was actively dividing stopped dividing for the duration of the experiment and occasionally these nondividing cells were observed to lyse as inferred by the loss of GFPuv fluorescence. The proportion of cells that were nondividing was 52 % and 58 % during growth on succinate and methanol, respectively, in this flow-through microscope-based system, and these cells were observed to be attached at the cell surface rather than by flagella. Lastly, it should be noted that no clumping of cells was observed during all flow-through culture experiments.

DISCUSSION

In this study we employed the fluorescent protein GFPuv to address population heterogeneity in exponentially growing cultures of *M. extorquens* AM1. First, fluorimetry was used to follow gene expression in bulk cultures and validate GFPuv as a reporter system for *M. extorquens* AM1 gene-expression dynamics. With the reporter system validated, flow cytometry and laser scanning microscopy were then employed to investigate population distribution in terms of cell size and fluorescence intensity.

The flow cytometry experiments revealed the presence of subpopulations of cells rather than a homogeneous or Gaussian distribution of cells. Based on the data collected from cultures grown on succinate and methanol during exponential and stationary phase, populations could be placed into two subpopulations, designated according to gating cytometry data: 14-28% of the total population consisted of larger cells expressing high levels of GFP, consistent with actively growing cells undergoing division, while the remainder of the population consisted of cells that were relatively smaller and expressing lower levels of GFP, consistent with either newly divided or non-dividing cells. Only ~85% of the total population responded to carbon shift, further supporting the suggestion that the population consisted partly of cells that were metabolically active and partly of cells that were much less active. The presence of a subpopulation of non-active cells is consistent with a previous study showing that 15-25 % of the cells from mid-exponential phase in batch culture on methanol did not exhibit detectable staining with the redox dye Redox Sensor Green, indicating low or no metabolic activity (Kalyuzhnaya et al., 2008). Furthermore, staining of M. extorquens AM1 cells with Redox Sensor Green followed by observation over time with a laser scanning microscope, using a growth chamber, showed that cells that did not accumulate the redox-sensing dye exhibited no growth (M. Kalyuzhnaya, personal communication). These results taken together suggest that in the order of 15% of the cells in the population are non-dividing and have low or no metabolic activity. Direct confirmation of these subpopulations was obtained by observing cells in a flow-

through system. In this environment, a large proportion of the cells did not divide over the course of at least three divisions by other cells. However, in the flow-through system, only the tethered cell is observed, not the newly divided daughter cell in each case. In addition, the nondividing cells were observed to be attached differently than the dividing cells, by the cell surface instead of by the flagellum. It is possible that this tethered flow-through culture system resulted in an artificially high proportion of non-dividing cells becoming attached, which would in turn bias the proportion of non-dividing cells in the population that was observed. However, these results show that some part of the population in an actively growing population is non-dividing. These cells may be non-viable, or they may be dormant. In the microscopy studies, such cells remained intact for up to 30 h, while others were observed to lyse, suggesting that the intact cells may be dormant.

Clearly, in order to maintain a significant population of non-dividing cells in an actively growing population, some of the dividing cells must convert to non-dividing cells. This phenomenon was observed microscopically in the flow-through system, confirming that it can occur, although the frequency was low. The frequency of this transition in batch culture is not known, but the flow cvtometry results would suggest it could be up to 15 % per generation. The generation of dormant cells in cultures is a well-known phenomenon and has been studied in E. coli with respect to antibiotic persistence (Balaban et al., 2004; Lewis, 2007). However, in that case the frequency is in the order of 10^{-5} in the wild-type, increasing to 10^{-2} in mutants (high-frequency persistence mutants; Moyed & Bertrand, 1983). The high frequency of apparently dormant cells in growing cultures of M. extorquens AM1 suggests that this bacterium may naturally have a highfrequency dormancy phenotype. Alternatively, a high frequency of cells may lose viability under these growth conditions.

The presence of subpopulations in significantly different physiological states suggests that response to perturbations such as carbon shift might differ for these subpopulations. The switch from multi-carbon growth to methylotrophic growth involves major changes in both assimilatory and dissimilatory metabolic pathways (Anthony, 1982), and a shift from energy-limited to reducing power-limited growth. Our results suggest that these subpopulations did respond differently to carbon shift.

As noted above, a portion of the population (~15%) does not respond to carbon shift and is potentially the same portion that is small, non-dividing, and characterized by low or no respiration rate by a redox-sensing dye. Most of the population (~85%) responds. However, within the subpopulation of larger, higher GFPuv-expressing, and dividing cells, a significant number of cells have extremely high fluorescence $(10^3-10^4 \text{ RFU} \text{ from cytometry data})$. It was calculated that the sum of the fluorescence from these cells dominated the total fluorescence from the population (up to \sim 3–45-fold brighter), even though they represented between 3% and 15% of the total population with no correlation to the optical density of the culture (data not shown). The large subpopulation that is small and dim contributes relatively little to the total fluorescence from the GFPuv fusion. This phenomenon was especially apparent during the carbon shift experiments and suggests that this small very bright subset of the population dominates bulk fluorimeter data, skewing the contributions of fluorescence response from the majority of the population.

The data we present here indicate that, in *M. extorquens* AM1, observing bulk population response to stimuli, as an average, does not fully describe the underlying contributions of the individuals that make up the population. Data averages in this study were dominated by the response of only a small subset of the population, based on fluorescence data from cytometric experiments, while a large portion of the population is either not responding or contributing little to the total population response. By observing population dynamics with flow cytometry during carbon shift experiments, it was possible to directly observe the significant proportion of the population that was non-dividing and did not respond to the shift.

It has been suggested that physiological heterogeneity in bacterial cultures provides a selective advantage in fluctuating environments (Kussell & Leibler, 2005; Acar *et al.*, 2008) and in response to stress (Booth, 2002; Aertsen & Michiels, 2005). Carbon shift is an environmental perturbation that often creates dramatic metabolic change. In this study, we show that when *M. extorquens* AM1 is shifted from one metabolic mode to another, the population response is dominated by a relatively minor proportion of cells, supporting the concept that physiological diversity allows a physiologically distinct subset of a bacterial population to respond in a way that sacrifices a subset of the population but benefits the population as a whole.

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