# Measuring the Rate of Conjugal Plasmid Transfer in a Bacterial Population Using Quantitative PCR

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ABSTRACT Horizontal transfer of genes between species is an important mechanism for bacterial genome evolution. In *Escherichia coli*, conjugation is the transfer from a donor (F<sup>+</sup>) to a recipient (F<sup>-</sup>) cell through cell-to-cell contact. We demonstrate what we believe to be a novel qPCR method for quantifying the transfer kinetics of the F plasmid in a population by enumerating the relative abundance of genetic loci unique to the plasmid and the chromosome. This approach allows us to query the plasmid transfer rate without the need for selective culturing with unprecedented single locus resolution. We fit the results to a mass action model where the rate of plasmid growth includes the lag time of newly formed F<sup>+</sup> transconjugants and the recovery time between successive conjugation events of the F<sup>+</sup> donors. By assaying defined mixtures of genotypically identical donor and recipient cells at constant inoculation densities, we extract an F plasmid transfer rate of 5 × 10<sup>-10</sup> (cells/mL · min)<sup>-1</sup>. We confirm a plasmid/chromosome ratio of 1:1 in homogenous F<sup>+</sup> populations throughout batch growth. Surprisingly, in some mixture experiments we observe an excess of F plasmid in the early saturation phase that equilibrates to a final ratio of one plasmid per chromosome.

## INTRODUCTION

As whole-genome sequencing of microbes has become increasingly routine, the accumulation of genomic data, and subsequent comparative genomics, has led to the understanding that bacterial genome plasticity in natural environments is extensive (1-4). This plasticity is largely a result of mobile genetic elements that can be transmitted between species through numerous mechanisms, generally termed horizontal gene transfer (HGT). HGT facilitates microbial pathogenicity (5), antibiotic resistance (6), biofilm formation (7), and novel carbon metabolism (8). Here we focus on one mechanism for HGT known as conjugation, which is the transfer of DNA through direct cell-to-cell contact. When the genes encoding the transfer machinery are contained on a plasmid, it is called a conjugative plasmid (9), which, upon transmission, enables the recipient to become an active donor.

Conjugative plasmids are a powerful tool for genome evolution as they can harbor and transfer genes between organisms sampling all genomes within an ecosystem (10). As much of our modern laboratory molecular biology and genetic engineering relies on the use of plasmids, concern for the uncontrolled spread of undesired genes prompted the early study of plasmid maintenance and loss. In an elegant series of articles, Levin and colleagues developed a massaction model for the growth, transfer, and persistence of both conjugative and nonconjugative plasmids within a population (11–14). This issue remains on the forefront of

*Submitted December 28, 2010, and accepted for publication April 27, 2011.* This article is dedicated to the late Joshua S. Lederberg.

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discussion, with concerns of acquired antibiotic resistance (15) or dissemination of genes into the environment from genetically modified food or bioenergy crops (16).

In this work, we focus on a model system, the F plasmid, or mating compatibility factor, in *Escherichia coli* (17) which encodes for a type-4 secretion system (18). Conjugation commences when the tips of F pili from a donor cell (termed  $F^+$ ) make contact with recipient cells ( $F^-$ ) (9,10) creating a mating bridge. Recent work has shown the pili to be a dynamic structure, extending and retracting continuously (19). When the pili retract, the cells form a mating pair aggregate (20).

Although numerous interesting mathematical models (21–28) to describe conjugation have been developed over the past decade, much of their experimental validation relies on quantifying the number of functional transconjugants through selective culturing. This strategy makes it difficult to parse the transfer rate of the plasmid from the additional mechanistic steps involved in the formation of functional transconjugants. Culturing also introduces the contribution of selection pressure and fitness.

A clever alternative to selective culturing is the use of donor-suppressed fluorescent reporter genes (29,30), which upon transfer, create fluorescent recipients. Although reporter genes like green fluorescent protein are functional in a broad number of species, the production of nonessential proteins can also be a metabolic burden, again creating a selection pressure. We have eliminated a number of these selective factors, by directly measuring the plasmid transfer rate through the relative abundance of genetic loci. These loci are enumerated using a quantitative PCR (qPCR) assay whose sensitivity allows enumeration at the single molecule (loci target) level. The reproducibility and low noise of the assay are a significant improvement over previous methods for the measurement of plasmid transfer kinetics.

### MATERIALS AND METHODS

#### Strains

W6 ( $F^+$ , *relA1 spoT1 metB1 rrnB-2 creC5-10*), an early derivative of the original K12 ( $F^+$ ) strain characterized by Lederberg et al. (17), was used as both a donor and recipient. The strains were acquired from the Yale Coli Genetic Stock Center. We created a W6 ( $F^-$ ) by curing W6 ( $F^+$ ) with acridine orange. The mechanism of action for acridine orange has been attributed to the delayed replication of the F plasmid versus the chromosome, therefore diluting it out of the population (31,32). Although the choice of a *relA spoT* background may influence the growth of the cells in media shift experiments, there is evidence that *relA spoT* mutants have comparable growth rates to *relA+ spoT*+ and the mutations do not influence F plasmid maintenance (33). The authors' choice of W6 was motivated by the desire to study the maintenance of the natural F factor versus engineered F' episomes under selection.

## Creating W6 (F<sup>-</sup>) isolates

W6 (F<sup>-</sup>) cells were created using a modified acridine orange assay (34). Following the published assay, W6 (F<sup>+</sup>) cells were inoculated into 3 mL Luria broth supplemented with 80  $\mu$ g/mL acridine orange (pH 7.6) and grown overnight at 37°C. Dilutions (~1/10<sup>6</sup>) of the overnight culture were plated on unsupplemented Luria broth plates at densities that produced well-resolved single colonies after overnight incubation. Colonies were then screened for the presence of the F<sup>+</sup> plasmid using the TraI/TolC qPCR assays (described in Quantitative PCR Assay, below). Although the abundance of TraI was reduced relative to TolC in the colonies tested, all colonies remained weakly positive for TraI. Further dilution of each colony by restreaking and overnight incubation did not reduce the TraI abundance in the new colonies, and in some cases, the TraI abundance increased.

Two modifications of the original acridine orange protocol (34) were found to reduce the TraI level below the qPCR background signal (no template control). One method required two or more sequential overnight growths in acridine-orange-supplemented Luria broth. The second method combined a single overnight growth in the presence of both acridine orange and mild heat shock (40°C). The investigators chose the latter method due to concern that increased exposure to the mutagenic agent could also damage unintended targets in the cells.

In a series of articles from Wada et al. (culminating in (35)) it is shown that  $\sigma$ -factor 32 (*rpoH*), the transcription factor that regulates stress response, including heat shock, is essential to F plasmid replication. The parent strain W6 F<sup>+</sup> showed no decrease in replication (confirmed by a 1:1 ratio of TolC/TraI in the qPCR assay) of the F plasmid when grown to saturation at elevated temperatures (40°C and 42°C), inferring no rpoH mutation. To assure acridine orange did not introduce a mutation into the rpoH gene during curing, we also sequenced the rpoH gene from our cured W6 F<sup>-</sup> strain. Sequencing confirmed the absence of any point mutation in the gene.

## Growth assays

W6 (F<sup>+</sup>) and W6 (F<sup>-</sup>) cells were inoculated into separate Luria broth (~7 mL) overnight cultures. The saturated cultures were then mixed in ratios of F<sup>+</sup>:F<sup>-</sup> (1:1(500  $\mu$ L);500  $\mu$ L), 1:10(100  $\mu$ L):1000  $\mu$ L), 1:10<sup>2</sup>(10  $\mu$ L: 1000  $\mu$ L), and 1:10<sup>3</sup>(1  $\mu$ L:1000  $\mu$ L)). To maintain the same inoculation density in all experiments, 200  $\mu$ L of these dilutions were then used to inoculate 50 mL Luria broth in 250-mL flasks (final concentration ~10<sup>6</sup> cells/ mL). The flasks were then placed in a water bath immersion shaker (model G67; New Brunswick Scientific, New Brunswick, NJ), with shaking

induced at 110 rpm and maintained at 37°C. The rate of mating pair formation has been shown to be constant over a broad range of shake flask shear forces (0–300 rpm) (27). A quantity of 100- $\mu$ L aliquots was extracted every 15 min without pausing the shaking or removing the flask from the immersion bath. The 100- $\mu$ L aliquot was diluted into 400- $\mu$ L water (MilliQ RO purified; Millipore, Billerica, MA) then placed in a 95°C dry bath to lyse the cells (preserving the cell number and denaturing potential degradation enzymes). Aliquots for the time series were then stored at -20°C until their use as template for the qPCR assays. Because our shaker can accommodate nine 250-mL flasks, all growth data reported in this article were gathered using simultaneously grown batch cultures, inoculated from the same overnight culture.

## **Mathematical model**

Our mathematical model is based on Stewart and Levin's (11) plasmid dynamics model in a resource-limited environment. Conjugation is described by mass-action kinetics between the plasmid-bearing and plasmid-free cells. During conjugation, recipients (the plasmid-free cells) receive a copy of plasmid from donors (the plasmid-bearing cells) and become transconjugants, whereas donors become temporarily exhausted (28). We incorporate the lag time into our model by introducing the rate of transconjugants becoming active donors,  $\lambda_T$ , and the rate of exhausted donors returning to active donors,  $\lambda_X$ . A schematic of the four states a cell can assume, and the allowed pathways for transition, are shown in Fig. 1.

As our assays are all batch culture (versus continuous culture), we assume a resource-limited growth model, or, in other words, logistic growth. The logistic model states that the growth rate is limited by the carrying capacity of the growth media, *K*. Hence the number of any cells in state as a function of time,  $\dot{n}$ , is the product of the growth rate,  $\psi(r)$ , the number of cells currently in that state, *n*, and the saturation limit of the media:

$$\dot{n} = \psi(r)n\left(1 - \frac{\sum n}{K}\right). \tag{1}$$

The term  $1 - \sum n/K$  reflects the quantity of remaining nutrients that the cells can utilize for growth. When the nutrients are exhausted, the cells

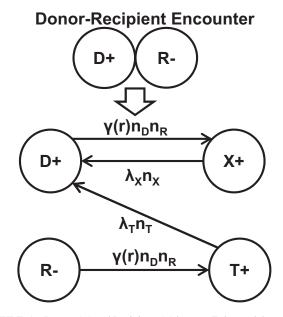


FIGURE 1 Donors (*D*) and Recipients (*R*) become Exhausted donors (*X*) and Transconjugants (*T*) through conjugation at rate  $\gamma(r)n_Dn_R$ ; *X* and *T* become active *D* at rate  $\lambda_X n_X$  and  $\lambda_T n_T$ , respectively.

reach the carrying capacity of the media,  $\sum n/K \rightarrow 1$ , and growth ceases,  $\dot{n} \rightarrow 0$ . We incorporate logistic growth (Eq. 1) into our model as the first term in Eqs. 2–5, which describe the allowed transitions schematized in Fig. 1:

$$\dot{n}_D = \psi(r)n_D \left(1 - \frac{n_D + n_R + n_T + n_X}{K}\right) - \gamma(r)n_D n_R + \lambda_T n_T + \lambda_X n_X,$$
(2)

$$\dot{n}_R = \psi(r) n_R \left( 1 - \frac{n_D + n_R + n_T + n_X}{K} \right) - \gamma(r) n_D n_R,$$
 (3)

$$\dot{n}_T = \psi(r)n_T \left(1 - \frac{n_D + n_R + n_T + n_X}{K}\right) - \gamma(r)n_D n_R + \lambda_T n_T,$$
(4)

$$\dot{n}_X = \psi(r)n_X \left(1 - \frac{n_D + n_R + n_T + n_X}{K}\right) - \gamma(r)n_D n_R$$

$$+ \lambda_X n_X.$$
(5)

$$\dot{r} = -e\psi(r)(n_D + n_R + n_T + n_X).$$
 (6)

The growth of each population, i.e., the number of donors,  $n_D$ ; recipients,  $n_R$ ; transconjugants,  $n_T$ ; and exhausted donors,  $n_X$ , are corrected by the number of cells actively conjugating  $\gamma(r)n_D n_R$ , where  $\gamma(r)$  is the conjugation rate. The growth must also correct for the number of cells trapped in states which cannot conjugate, X and T, and are represented by the terms  $\lambda_X n_X$  and  $\lambda_T n_T$ , respectively. Finally, we describe the exponential consumption of resources by Eq. 6, where *e* is the resource consumption for one cell division.

As our governing model is resource-limited logistic growth, we can extract the maximum conjugation rate though a hyperbolic model consistent with Stewart and Levin (11). Often used in substrate-limited enzyme kinetics (Michaelis-Menten), the hyperbolic model allows us to describe the maximum velocity of a reaction under the resource constraint. Monod (38) proposed that bacterial growth kinetics resemble enzyme kinetics in terms of substrate limitation, an idea that was further refined for modeling conjugative transfer by Andrup and Andersen (28). Here the growth rate  $\psi(r)$  and conjugation rate  $\gamma(r)$  are related to the resource, *r*, through their maximum rates,  $\psi_{MAX}$  and  $\gamma_{MAX}$ , respectively; *Q* is the concentration of resource when the rate is half-maximum:

$$\psi(r) = \frac{r\psi_{MAX}}{Q+r},\tag{7}$$

$$\gamma(r) = \frac{r\gamma_{MAX}}{Q+r}.$$
(8)

The units of  $\gamma_{MAX}$ , the maximum conjugation rate, are consistent with the precedent set by the field, and derived from the units

$$\frac{\left(\frac{cells}{mL}\right)_{transconjugants}}{\left(\frac{cells}{mL}\right)_{donor} \left(\frac{cells}{mL}\right)_{recipient} \cdot \min} = \left(\frac{cells}{mL} \cdot \min\right)^{-1}.$$
 (9)

All simulations were performed in MATLAB (Ver. 7.8.0.347 (R2009a); The MathWorks, Natick, MA) using the symbolic math and optimization toolboxes.

#### **Quantitative PCR assay**

Quantitative PCR is routinely used for quantifying template abundance and when optimized, can achieve single molecule sensitivity. Fig. 2 *a* shows the output of a qPCR assay. The amplification curve is proportional to the amount of double-stranded DNA product as the reaction progresses in time (cycle number). The relative abundance of starting template can be quantified by the time elapsed for the reaction to produce equivalent amounts of double-stranded DNA product (labeled as a threshold in Fig. 2 *a*). As the cell population grows, the number of target loci grows proportionally. As the amount of starting template increases, the time necessary to reach the threshold value decreases. The threshold values, *Ct*, can be translated into a growth curve (Fig. 2 *b*) where each amplification curve in Fig. 2 *a* corresponds to a collected time point in the time series of the batch growth culture.

The number of genes, n, is converted to Ct values as

$$Ct = Ct_0 - \log_2(n).$$
 (10)

 $Ct_0$  is an arbitrary constant, and is determined by best fitting qPCR data. Both plasmid-bearing and plasmid-free cells have TolC locus (on chromosome), but only the plasmid-bearing cells have the TraI locus (on plasmid). The TolC *Ct* values correspond to the total number of cells, whereas TraI *Ct* values only correspond to plasmid-bearing cells,

$$Ct(TolC) = Ct_0 - \log_2(n_D + n_R + n_T + n_x),$$
 (11)

$$Ct(TraI) = Ct_0 - \log_2(n_D + n_T + n_X), \qquad (12)$$

where  $n_D$ ,  $n_R$ ,  $n_T$ , and  $n_X$  are the abundance of cells in the states defined by Fig. 1.

All qPCR assays used a master mix consisting of final concentration: 2 mM MgCl<sub>2</sub>, 200  $\mu$ M dNTP mix, 1 U (per 25  $\mu$ L volume) Roche FastStart Enzyme blend (Roche Diagnostics, Mannheim, Germany), 1× Roche FastStartBuffer (Roche Diagnostics), 0.4  $\mu$ M forward and reverse primers, 2  $\mu$ M SYTO 9 (Invitrogen, Life Technologies, Carlsbad, CA), and 1× ROX reference dye (Invitrogen, Life Technologies). We use SYTO9 dye for double-stranded DNA quantification as it has been shown to have fewer sequence and concentration artifacts (39). A quantity of 5  $\mu$ L of the lysed frozen aliquots was used as template for the qPCR reactions (per 25  $\mu$ L reaction). The primer sequences were designed using an in-house algorithm (Spangler Q-Design). (See Table 1 for a list of primers and thermal programs used.)

All reactions were performed in a BioRad Chromo4 Instrument (Bio-Rad Laboratories, Hercules, CA), in 96-well, clear bottom, hard-shell, skirted assay plates (Bio-Rad Laboratories) with Microseal B sealing tape (Bio-Rad Laboratories). The instrument filter settings were set for FAM and

**b** 15 а -0000000 0 19 Log Fluorescence Threshold 23 ö 27 -3 31 Ct -4 0 35 30 10 20 100 200 300 400 Cycle Time (min)

FIGURE 2 (a) Log plot of the amplification curves from the qPCR reaction. The threshold cycle (Ct) is the cycle number at which the fluorescent signal of the reaction crosses the threshold value. (b) The Ct value is inversely related to the amount of starting template. A plot of the Ct values versus time yields the growth curve for the target locus.

TABLE 1 Primers and thermal program

Primers	$5' \rightarrow 3'$	Thermal program	
TolC Forward	CGACAAACCACAGCCGGTTA	95°C for 6 min	1 cycle
TolC Reverse	CAGCGAGAAGCTCAGGCCA	95°C for 30 s	Repeat for 35 cycles
TraI Forward	GCCATTCATCTTGCCCTTCC	54°C for 30 s	
TraI Reverse	GCATGACCGCCTCCTTACC	Plate read 72°C for 25 s	

ROX for SYTO9 and ROX, respectively, where ROX is used as a passive reference. Both the error in replicate qPCR reactions using the same template (frozen cell aliquots from a single time series) and the error between separate time series assays were <1 cycle (data not shown), including the error in the saturated phase.

# **RESULTS AND DISCUSSION**

We present what we believe to be a novel qPCR protocol to measure the growth of a bacteria culture, which enables us to capture a dense sampling of the growth kinetics with unprecedented sensitivity (single molecule/target). We have also demonstrated the utility of an extremely low noise collection and analysis protocol that allows us to perform the qPCR assay without further DNA purification. As shown in Fig. 2 a, the relative abundance of loci are determined for a threshold value, and plotted against time to create a growth curve (Fig. 2 b). To our knowledge, this is the first demonstration of using qPCR to measure growth kinetics.

Whereas selective culturing methods quantify the number of functional transconjugants, the qPCR assay allows us to directly measure the growth kinetics of two genetic locithe E. coli chromosome (TolC), and the F plasmid (TraI). This removes the additional time lag associated with production of the proteins to survive the selection condition, as well as the beneficial driving force potentially associated with a selection condition. We have also attempted to remove the selection pressure associated with variable genetic backgrounds by measuring the plasmid transfer kinetics in an isogenic strain set.

Growth of a pure  $F^+$  culture and mixture experiments ( $F^+$ and F<sup>-</sup> cells of identical chromosomal lineage) were performed to extract the contributions of replicative  $\psi(r)$  and conjugative growth  $\gamma(r)$ . Fig. 3 shows the growth of a pure  $F^+$  where the ratio of TolC (*circle*) to TraI (*square*) locus is ~1:1 throughout the batch growth process. We can assume that the only mechanism for increasing the abundance of the TraI locus is replication, as mating between F<sup>+</sup> cells is unlikely due to surface exclusion mechanisms encoded by TraS and TraT genes (40). Therefore, we can extract the maximum growth rate,  $\psi_{MAX}(r) = 0.035 \text{ min}^{-1}$ from the curve in Fig. 3 by fitting the exponential phase.

We can estimate the order of magnitude for the carrying capacity, K, experimentally by counting the number of cells at saturation using a hemocytometer. Because r scales with e (Eq. 6), we have chosen to define them in terms of arbitrary units. Allowing Q = 1 arbitrary unit, and r = 100 arbitrary

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units, Eq. 7 defines a value for  $e = 1.5 \times 10^{-8}$  arb. unit mL  $cell^{-1}$ . Values of *e* have been reported for defined glucose supplemented minimal media (11). However, Luria broth, the common laboratory media for rapid growth of E. coli cultures, is not supplemented with glucose. Growth has been shown to be limited by the utilization of catabolizable amino acids (41). Fig. 4, a and b, shows the growth of the TolC (Fig. 4 a)

and TraI (Fig. 4 b) loci in mixture experiments of donor/ receptor, 1:1 (upward-pointing triangle), 1:10 (diamond),  $1:10^2$  (square), and  $1:10^3$  (circle). For comparison, the pure  $F^+$  culture data (data of Fig. 3) is shown in both figures as downward-pointing triangles.

We observe the rate of growth for the chromosomal loci (Fig. 4 a) is similar for different mixtures (Fig. 4 a, inset) as well as the pure  $F^+$  culture (*downward-pointing triangle*). However, when we examine the rate of growth of the plasmid TraI loci (Fig. 4 b), the exponential phase differs from the growth of the pure  $F^+$  culture reflecting the contribution of conjugation events.

The solid lines shown in Fig. 4, a and b, are plots of the best-fit simulation determined from the MATLAB optimization toolbox (solving Eqs. 2-7). We allow the least-squares algorithm to search for the best values, starting from our estimates of  $\psi_{MAX}$ , Q, e, and K discussed above and the reported values for  $\lambda_T$  (28,37) and  $\lambda_X$  (37), 90 and 30 min, respectively. Table 2 reports the best-fit values determined

15 19 <sub>ວ</sub> 23 27 31 200 400 600 0 Time (min)

FIGURE 3 Time series plot of TolC (circle) and TraI (square) for a pure F<sup>+</sup> culture.

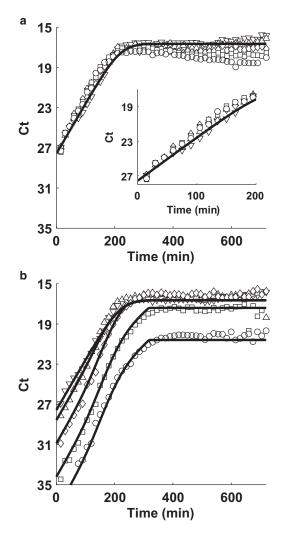


FIGURE 4 (*a*) TolC and (*b*) TraI simulation (*solid line*) and quantitative PCR data (*solid symbols*). Each plot represents a different inoculation ratio of donors to recipients: Pure  $F^+$  (donor) culture (*downward-pointing triangle*), 1:1 (*upward-pointing triangle*), 1:10 (*diamond*), 1:100 (*square*), and 1:1000 (*circle*).

by the algorithm. Note, the values of  $\psi_{MAX}$ , Q, K,  $\lambda_T$ , and  $\lambda_X$ did not change in finding the best fit. We find a slightly different value for  $e = 1.8 \times 10^{-8}$  arb. unit mL cell<sup>-1</sup> (vs.  $1.5 \times 10^{-8}$  arb. unit mL cell<sup>-1</sup> estimated previously) and determine the maximum plasmid transfer rate to be  $\psi_{MAX} = 5 \times 10^{-10}$  mL cell<sup>-1</sup> min<sup>-1</sup>.

Fig. 5 demonstrates the influence of various parameters in our model. In Fig. 5 *a*,  $\lambda_T$  and  $\lambda_X$  are varied by a factor of 10 from our best-fit simulation (*solid line*) for all mixture experiments. The physical equivalent is a decrease or increase by a factor of 10 in the lag times associated with the newly formed transconjugants and exhausted donors before returning to the active donor pool. The dashed lines represent  $\lambda_T = 1/9 \text{ min}^{-1}$ ,  $\lambda_X = 1/3 \text{ min}^{-1}$  whereas the dashdot lines represent  $\lambda_T = 1/900 \text{ min}^{-1}$ ,  $\lambda_X = 1/300 \text{ min}^{-1}$ . Note the influence primarily effects the transition from the late exponential phase into saturation.

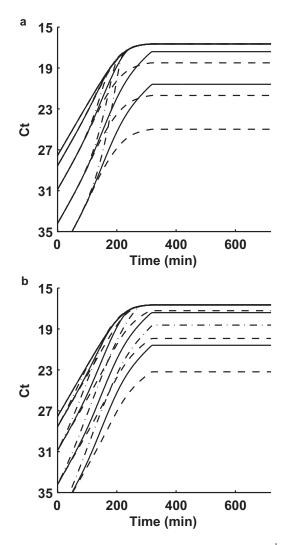
Physical Property	Parameter	Value	Reference
Maximum growth rate	$\psi_{MAX}$	$0.035 \text{ min}^{-1}$	This work
Maximum conjugation rate	$\psi_{MAX}$	$5 \times 10^{-10} \text{ mL}$ cell <sup>-1</sup> min <sup>-1</sup>	This work
Concentration of the	Q	1 arbitrary unit	
resource when the rate is half-maximum			
Resource consumption per cell division	е	$1.8 \times 10^{-8}$ arb. unit mL cell <sup>-1</sup>	This work
Carrying capacity	Κ	$2 \times 10^9 \text{ cell mL}^{-1}$	This work
Delay in new transconjugants become active donors	$\lambda_T$	$1/90 \text{ min}^{-1}$	(28,37)
Delay in exhausted donors returning to the active	$\lambda_X$	1/30 min <sup>-1</sup>	(37)
donor pool			

Fig. 5 *b* shows the influence of the maximum conjugation rate,  $\gamma_{MAX}$ . The solid lines represent the best fit from our simulation ( $\gamma_{MAX} = 5 \times 10^{-10}$  mL cell<sup>-1</sup> min<sup>-1</sup>). If we vary  $\gamma_{MAX}$ by an order of magnitude from the best fit, the influence is strong within the early exponential phase. The physical significance of varying  $\gamma_{MAX}$  changes the competition between replication and conjugation, which both contribute to the growth of the TraI marker. At larger values of  $\gamma_{MAX}$ , conjugation is the dominant mechanism, shown by the dashed lines in Fig. 5 *b*, where  $\gamma_{MAX} = 5 \times 10^{-9}$  mL cell<sup>-1</sup> min<sup>-1</sup>. When  $\gamma_{MAX}$  is smaller, replication dominates, and the early exponential rate is slower, shown by the dash-dot lines in Fig. 5 *b*, where  $\gamma_{MAX} = 5 \times 10^{-11}$  mL cell<sup>-1</sup> min<sup>-1</sup>.

Our best-fit value for the plasmid transfer rate  $5 \times 10^{-10}$ mL cell<sup>-1</sup> min<sup>-1</sup> is in agreement with previous estimates (14,44–46) of the bulk conjugation rates found through functional transconjugant enumeration  $(10^{-8}-10^{-15} \text{ mL})$ cell<sup>-1</sup> min<sup>-1</sup>) However, in contrast to previous work, our assay allows for direct measurement of the plasmid transfer rate. The use of multiple mixture experiments of the same inoculation density allows us to find parameters that satisfy a large range of donor to recipient concentration ratios. The value  $\gamma_{MAX}$  can be used to estimate the maximum conjugation rate per donor for different donor concentrations. In our experiment, donor concentrations vary from  $10^6$  to  $10^9$  cells mL<sup>-1</sup>. Hence our conjugation rate per donor varies from  $0.3 \times 10^{-3}$  to  $0.3 \text{ min}^{-1}$ . The latter number is consistent with previous estimates of 0.15  $min^{-1}$ from Andrup and Anderson (28) and 0.25  $min^{-1}$  from Dusenbery (47).

To understand the physical significance of  $\gamma_{MAX}$ , recall the  $\gamma(r) n_D n_R$  term in Eqs. 2–5. This term defines the number of conjugations per unit time, which is analogous to the number of encounters per unit time for two kinds of spherical particles in liquids. The encounter rate of molecules *A* and *B* of identical radii due to diffusion is (47)

$$\frac{8k_{\rm B}T_K}{3\eta}n_An_B = s n_A n_B, \qquad (13)$$



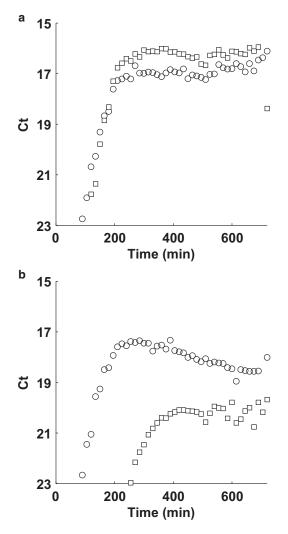


FIGURE 5 (a) The effect of variation in  $\lambda_T$  and  $\lambda_X$ :  $\lambda_T = 1/9 \text{ min}^{-1}$ ,  $\lambda_X = 1/3 \text{ min}^{-1}$  (dashed line);  $\lambda_T = 1/90 \text{ min}^{-1}$ ,  $\lambda = 1/30 \text{ min}^{-1}$  (solid line);  $\lambda_T = 1/900 \text{ min}^{-1}$ , and  $\lambda_X = 1/300 \text{ min}^{-1}$  (dash-dot line). (b) The effect of variation in T:  $T = 5 \times 10^{-9} \text{ mL cell}^{-1} \text{ min}^{-1}$  (dashed line);  $T = 5 \times 10^{-10} \text{ mL cell}^{-1} \text{ min}^{-1}$  (dash-dot line). (c) The effect of variation in T:  $T = 5 \times 10^{-9} \text{ mL cell}^{-1} \text{ min}^{-1}$  (dash-dot line);  $T = 5 \times 10^{-10} \text{ mL cell}^{-1} \text{ min}^{-1}$  (dash-dot line).

where  $k_{\rm B}$  is the Boltzmann constant (1.38 × 10<sup>-23</sup> J K<sup>-1</sup>),  $T_K$  is temperature (310 K (37°C)), and  $\eta$  is viscosity (1 mPa s) and  $n_A$ ,  $n_B$  represent the concentration of particles a and b. We find  $s = 6 \times 10^{-10}$  mL particles<sup>-1</sup> min<sup>-1</sup>. This is very similar to the value we found for the maximum conjugation rate  $\gamma_{MAX} = 5 \times 10^{-10}$  mL cell<sup>-1</sup> min<sup>-1</sup>, and suggests that most encounters result in plasmid transfer.

We also note an interesting effect, shown in Fig. 6, *a* and *b*. Fig. 6 *a* shows the growth data of both TolC (*circle*) and TraI (*square*) loci for the 1:1 mixture experiment shown in Fig. 4, *a* and *b*. Note the overshoot of TraI in early saturation. The TolC abundance gradually increases to meet the TraI abundance. A different effect is shown in Fig. 6 *b*, which shows the growth data of both TolC (*circle*) and TraI (*square*) loci for the 1:10<sup>3</sup> mixture experiment (from

FIGURE 6 Time series plot of TolC (*circle*) and TraI (*square*) for  $F^+:F^-$  mixtures (a) 1:1 and (b) 1:10<sup>3</sup>.

Fig. 4, *a* and *b*). The TolC loci actually decreases in abundance to equilibrate with the TraI abundance. We find 1:1 abundance of TraI/TolC in samples taken 24 h into the batch growth assay (data not shown). As we have previously mentioned, the metabolic potential of Luria broth is limited by the catabolizable amino acids. Perhaps this is evidence of lethal zygosis (42,43) and canabalism of resources by the culture in saturation phase.

#### CONCLUSION

We have demonstrated what we believe to be a novel assay using qPCR to quantify the abundance of genetic loci throughout a batch growth process. The experimental design allows us to directly measure the plasmid transfer rate during conjugation at the nucleic acid level, rather than the functional protein level through selective culturing. By confining our mating experiments within a single genetic background, we also reduce selection and fitness pressures. Using a mass action model where the rate of plasmid growth includes the lag time of newly formed  $F^+$  transconjugants and the recovery time between successive conjugation events of the  $F^+$  donors, we find a single maximum conjugation rate for mixture experiments varying from 1:1 to 1:10<sup>3</sup> in fixed density donor/recipient inoculation.

Finally, we observe different behaviors of the mixture batch cultures as they approach equilibrium values of one plasmid per chromosome in saturation phase. Although this work focused on a model system, we anticipate this method can be extended to nonmodel systems such as disease progression or evolving populations in environmental samples.

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