Tuning and functionalization of logic gates for time resolved population programming

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Abstract

In order to increase our command over genetically engineered bacterial populations in bioprocessing and therapy, synthetic regulatory circuitry needs to enable the temporal programming of a number of consecutive functional tasks without external interventions. In this context, we have engineered a genetic circuit encoding an autonomous but chemically tunable timer in *Escherichia coli*, based on the concept of a transcription factor cascade mediated by the cytoplasmic dilution of repressors. As proof-of-concept, we used this circuit to impose a time-resolved two-staged synthetic pathway composed of a production-followed-by-lysis program, via a single input. Moreover, via a recombinase step, this synchronous timer was further engineered into an asynchronous timer in which the generational distance of differentiating daughter cells spawning off from a stem-cell like mother cell becomes a predictable driver and proxy for timer dynamics. Using this asynchronous timer circuit, a temporally defined population heterogeneity can be programmed in bacterial populations.

Introduction

Industrial bioprocessing depends on metabolically engineered microorganisms in bioreactors to (over)produce compounds that they would natively not (or insufficiently) produce (1-3), and is becoming an increasingly important cornerstone in sustainable development and health (4). Indeed, the recent revolution in our capacity to understand and engineer metabolic pathways has resulted in microbial cell factories that can produce a wide variety of biochemical products, including commodities for which no alternative synthesis routes exist (5-8).

However, next to engineering and implementing the metabolic pathways themselves, outstanding challenges for unlocking the full potential of bioprocessing include finding novel ways to increase our overall command of the behaviour of microbial bioreactor populations. As such, synthetic genetic circuitry has already been designed that overlays metabolic pathways with dynamic feedback regulation, whereby the accumulation or depletion of key metabolic intermediates in the cell serves as a trigger to selectively pause up- or downstream branches of the pathway (9,10). Also, quorum sensing dependent circuits have meanwhile been elaborated to properly time and synchronize expression of metabolic pathways throughout bioreactor populations (11,12).

An interesting class of novel circuitry in this context would be synthetic regulatory systems that aim to autonomously impose a defined timing or succession of gene expression events, as it would consequently allow to spread tasks of bioreactor populations in time. A number of interesting circuits and theoretical models implementing temporal aspects in gene regulatory circuits have already been pioneered (13-17), although usually not designed for the time-resolved programming of gene expression and often accompanied with restrictions on culturing or growth. Nevertheless, a brief succession in gene expression was recently accomplished by Pinto et al. (16) by employing cascades of accumulating orthogonal sigma factors, thereby delaying transcriptional responses for up to two doubling times in *Escherichia coli*.

Despite this progress, our means to more elaborately program bioreactor populations and subpopulations with predefined consecutive tasks over several generations is still rather limited. In this

study, we therefore devised a timer circuit that is based on cascaded repressors in which the delay is imposed by the gradual dilution of the most downstream repressor. The resulting delay can be chemically tuned and used to autonomously separate a production and subsequent lysis phase in an *E. coli* population. Moreover, this synchronous timer was further engineered to become deterministically asynchronous by imposing recombinase-mediated asymmetric segregation of the DNA fragment encoding the delay-imposing repressor in the cascade.

Material & Methods

Strains, media, and cultivation

For all experiments in this study *Escherichia coli* K12 MG1655 (further referred to as MG1655) and constructs thereof have been used. All plasmids constructed in this study were cloned into *E. coli* DH10B sAJM.1504 (18) after assembly. Various strains from the Marionette Sensor Collection, a gift from Christopher Voigt (Addgene Kit #1000000137), were utilized in this study as PCR templates and/or intermediate DNA assembly hosts (18).

For cultivation either Lysogeny Broth (LB; 10 g/L tryptone, 5 g/L yeast extract, 5 g/L NaCl; with 1.5% agar added for agar plates), or AB medium (2 g/L $(NH_4)_2SO_4$, 7.5 g/L $Na_2HPO_4 \times 2H_2O$, 3 g/L KH_2PO_4, 3 g/L NaCl, supplemented with 0.1 mM $CaCl_2$, 1 mM $MgCl_2$, 0.003 mM $FeCl_3$, 10 mg/L Thiamine, 25 mg/L Uracil, 0.2% Casamino acids, and 0.4% glucose) was used. Where needed, the medium was supplemented with appropriate antibiotics: ampicillin (100 mg/mL), chloramphenicol (30 mg/mL), kanamycin (50 mg/mL), tetracycline (10 mg/mL), gentamicin (20 mg/mL).

All strains were aerobically grown on an orbital shaker at 37°C with the exception for strains harboring the pKD46 helper plasmid, which were grown aerobically at 30°C. For Stationary-phase cultures, cells were grown for 16-18h, while for exponential-phase cultures, stationary phase cells were diluted 1/1,000 in fresh medium and grown for 3 to 4 h.

Plasmid and strain construction

All plasmids created in this study were constructed via Gibson assembly using homology overhangs of 20-40 bp. Gibson assembly master mix was made by 5-fold diluting 5×ISO buffer (0.5 M Tris-HCl pH 7.5, 50 mM $MgCl_2$, 1 mM gATP, 1 mM gTTP, 1 mM gGTP, 1 mM gCTP, 50 mM DTT, 5 mM NAD25%, and 25% PEG-8000) into MilliQ and supplementing with 5.3 U/mL T5-exonuclease (NEB), 33.3 U/mL Phusion DNA polymerase (NEB), and 5.3 U/µL Taq DNA ligase (ABclonal). In preparation for the assembly, first DNA fragments were PCR amplified using primers with respective homology overhangs at their 5´end. If needed, DPN1 digestion was performed in Tango buffer, using <1µL DPN1 restriction enzyme (10 U/µL, Thermo Scientific) and incubating for 1 h at 37°C, followed by heat inactivation (80°C

for 20 minutes). The purified DNA fragments were mixed in a ca. 3:1 ratio (insert:vector), and 5 µL of this mix was added to 15 µL aliquots of Gibson assembly master mix thawed on ice. The resulting samples were incubated in a heat block (VWR) pre-heated to 50°C for 1 h, dialysed, and used for electroporation.

For chromosomal replacements and insertions, Lambda Red recombineering was used (19). For the construction of MG1655 AT, the *lac* regulon was first replaced with a *tetA-sacB* cassette (20) in an MG1655 strain harboring the pKD46 plasmid (19). Next, using the *tetA-sacB* counter-selection protocol of Li et al. (20), the *lac::tetA-sacB* region was substituted with a P_{Tet*}-$vanR^{AM}$ construct. Subsequently, this construct was expanded by transcriptionally fusing an *mCerulean3-frt-*Cm^R*-frt* cassette downstream of $vanR^{AM}$. Next, the *frt-*Cm^R*-frt* fragment was replaced by a $cymR^{AM}$-P_{CymRC}-*T7RNAP-frt-*Km^R*-frt* cassette (18), after which the region comprising P_{CymRC}-*T7RNAP-frt-*Km^R*-frt* was replaced by P_{CymRC}-*tetR-mKate2-*P_{VanCC}-*sYFP2-frt-*Cm^R*-frt*, yielding MG1655 AT.

For the construction of MG1655 AAT, *tetR* of MG1655 AT was first replaced with a *bxb1-*Gm^R cassette flanked with Bxb1 irreversible recombination sites. Next, its P_{Tet*}-$vanR^{AM}$–*mCerulean3-frt-*Cm^R*-frt* fragment was replaced by an *frt-*Km^R*-frt* cassette, after which this cassette was flipped with pCP20 (21) Finally, the *GmR* marker was replaced by the previously deleted P_{Tet*}-$vanR^{AM}$– *mCerulean3-frt-*Cm^R*-frt* fragment, resulting in MG1655 AAT.

Liquid cultivation experiments

For pTApp circuit characterization in batch experiments, overnight cultures were diluted 1:500 into Erlenmeyer flasks containing 25-100 mL AB medium, and grown at 37°C on orbital shakers for 4 h. Cultures were subsequently normalized to an OD of 0.2 using pre-warmed AB medium, and 50 mL of culture supplemented with appropriate inducers were further incubated in Erlenmeyer flasks at 37°C. All strains harboring the pTApp plasmid were continuously grown in the presence of 50 mg/L kanamycin.

Lycopene quantification

For lycopene extraction, 1 mL culture samples were centrifuged for 10 min at 4°C and 3,400 × g. The cells were then washed once with 0.085% NaCl and centrifuged again under the same conditions. Next,

all supernatant was carefully removed followed by resuspension of the pellet in pure acetone (99.5%). After overnight storage at 4°C, heat extraction was performed for 20 min in a 55°C heat block shaking at 400 rpm, after which adsorption was measurement at 450 nm using a microplate reader (Multiscan FC, Thermo Scientific).

Microscopy

Time-lapse fluorescence microscopy experiments were performed by placing cells between AB agarose pads (AB medium supplemented with 1.5% agarose) and a cover glass using Gene Frames (Life Technologies), followed by incubation at 37°C using an Okolab cage incubator (Okolab, Ottaviano, Italy).

Cells were imaged using a Ti-Eclipse inverted microscope (Nikon, Champigny-sur-Marne, France), equipped with a 60× Plan Apo λ oil objective, a TI-CT-E motorized condenser and a Nikon DS-Qi2 camera. CFP, YFP and RFP were imaged with triple dichroic (475/540/600 nm) emission filter, and a SpecraX LED illuminator (Lumencor, Beaverton, USA) as a light source.

Image analysis

Fluorescence microscopy images were analyzed using the DeLTA 2.0 image analysis pipeline (22) for cell segmentation and fluorescence feature extraction, after which the output was further processed using python. In order to accommodate for crowding effects in time-lapse experiments, fold changes were calculated by dividing the average cellular fluorescence value of an induced condition by the otherwise equally treated basal fluorescence level of the non-induced control. Therefore, values are given as multiples of the non-induced control basal level at the same time point.

In graphs comparing multiple fluorescent reporters (with inherently different intensity ranges), normalization was applied by dividing all fold change values of a channel by the maximum fold change achieved by the Cuma (100 μM) induced reference condition. As a result, all normalized values are given as fractions of their maximum fold change.

Statistical analysis

GraphPad Prism was used to determine the statistical significance. When appropriate, two-tailed, paired Student's t-tests and one-way ANOVA with Tukey's tests were applied. Significance intervals are given as such: *$P < 0.05$; **$P < 0.01$; ***$P < 0.001$; ****$P < 0.0001$. Best fit values were determined according to the hill function with uncertainty represented as 95% prediction bands.

Results and Discussion

Construction and characterization of an autonomous timer circuit

Since the gradual dilution of repressors has already been shown to impose an intrinsic (and often unwanted) delay in gene expression (23), we coined a synthetic genetic circuit based on a regulatory cascade of three repressors in *Escherichia coli* (Fig. 1A). To avoid promoter leakiness and/or the copy number of the circuit to interfere with the circuits temporal response, we chose (***i***) to employ the high dynamic range P_{Tet*}/TetR, P_{CymRC}/CymR^{AM} and P_{VanCC}/VanR^{AM} promoter/repressor pairs described by Meyer et al. (18) that can also be chemically derepressed (via Anhydrotetracycline or aTc, Cuminic acid or Cuma, and Vanillic acid or Van, respectively), and (***ii***) to chromosomally insert the circuit as a single copy in place of the *E. coli* MG1655 *lac* operon. Finally, in order to make circuit functionalities readily assessable with time-lapse fluorescence microscopy (TLFM), the circuit was equipped with the genes of three spectrally compatible fluorescent protein reporters (i.e. *mKate2*, *mCerulean3*, and *sYFP2*; Fig. 1A). The resulting *E. coli* MG1655 strain harbouring this **a**utonomous **t**imer circuit is further referred to as MG1655 AT.

The transcriptional units of the cascade were arranged such that in the ground state of the circuit (Fig. 1A, Stage 0), the constitutively expressed *cymR^{AM}* repressor silences P_{CymRC}, which is responsible for the expression of *tetR* and *mKate2* (referred to as *rfp*). Therefore, in the absence of TetR, *vanR^{AM}* and *mCerulean3* (referred to as *cfp*) are actively expressed from P_{Tet*}. Consequently, in Stage 0, the VanR^{AM} silenced promoter (P_{VanCC}) will not express *sYFP2* (referred to as *yfp*). The timer is activated by inducing P_{CymRC} with Cuma (Fig. 1A, Stage 1), resulting in the production of RFP and TetR. The latter represses P_{Tet*}, thereby halting *vanR^{AM}* expression, and in turn causing the eventual de-repression of P_{VanCC} reported by YFP fluorescence (Fig 1A, Stage 2). Since the initial abundance of the gradually diluting VanR^{AM} determines the actual delay of P_{VanCC} derepression, we employed a translation-maximized *vanR^{AM}* ribosome binding site (RBS). Moreover, since leakiness of TetR expression could potentially compromise VanR^{AM} expression levels, *tetR* was fitted with an RBS of moderate strength and an SsrA-tag (expediting degradation of the resulting TetR protein). As such, the cells should only exhibit CFP

fluorescence in the non-induced ground state and, upon induction with Cuma, first become red fluorescent, lose their CFP fluorescence, and eventually become yellow fluorescent.

When microscopically assessed on agarose pads (Fig. 1B), MG1655 AT showed no signs of leakiness and presented a delay time of ca. 3 h, as determined by the temporal separation between start of *rfp* expression (Stage 1) and *yfp* expression (progression to Stage 2; Fig. 1B). Likewise, besides the immediate increase of RFP fluorescence, CFP fluorescence started to decline within the first hour of induction (Fig. 1B). Therefore, P_{Tet*} was readily silenced by induction of TetR expression, indicating that the majority of the delay was imposed by the cytoplasmic dilution of $VanR^{AM}$. At the same time, during the first 3 h of timer induction barely any YFP signal was observed, while at ca. 3 h it readily increased.

In order to more precisely assess the temporal dynamics of the individual circuit steps of MG1655 AT, we analysed the time-lapse fluorescence images for average singe cell fluoresce (Fig. 1C). Considering that the maturation time (t_{50}) of our RFP (mKate2) is ca. 34 min (24), a significant fluorescence increase within the first 45 min suggests that Stage 1 is initiated readily upon induction. Stage 2 activity is being reported by the extremely fast maturing YFP (SYFP2, t_{50}=4 min; (24)) and can therefore be estimated with a negligible offset by direct fluorescence readout. At ca. 3 h of induction, the YFP fluorescence starts exceeding the basal level of the non-induced control by 10-fold, while at ca. 4 h the half maximum expression is reached compared to direct Van-induced Stage 2 derepression (which directly derepresses P_{VanCC}; cfr. Fig. S1). At the same time, supplementing pads with both Cuma and aTc prevented the (delayed) increase in YFP fluorescence as P_{Tet*}-$VanR^{AM}$ expression would not be blocked by the Cuma induced P_{CymRC}-TetR (Fig. S1), proving that the delayed YFP increase in Cuma triggered MG1655 AT indeed stems from TetR silenced $VanR^{AM}$ expression and the subsequent cytoplasmic dilution of $VanR^{AM}$. Therefore, the circuit cloned into MG1655 AT reliably imposes time resolved gene expression.

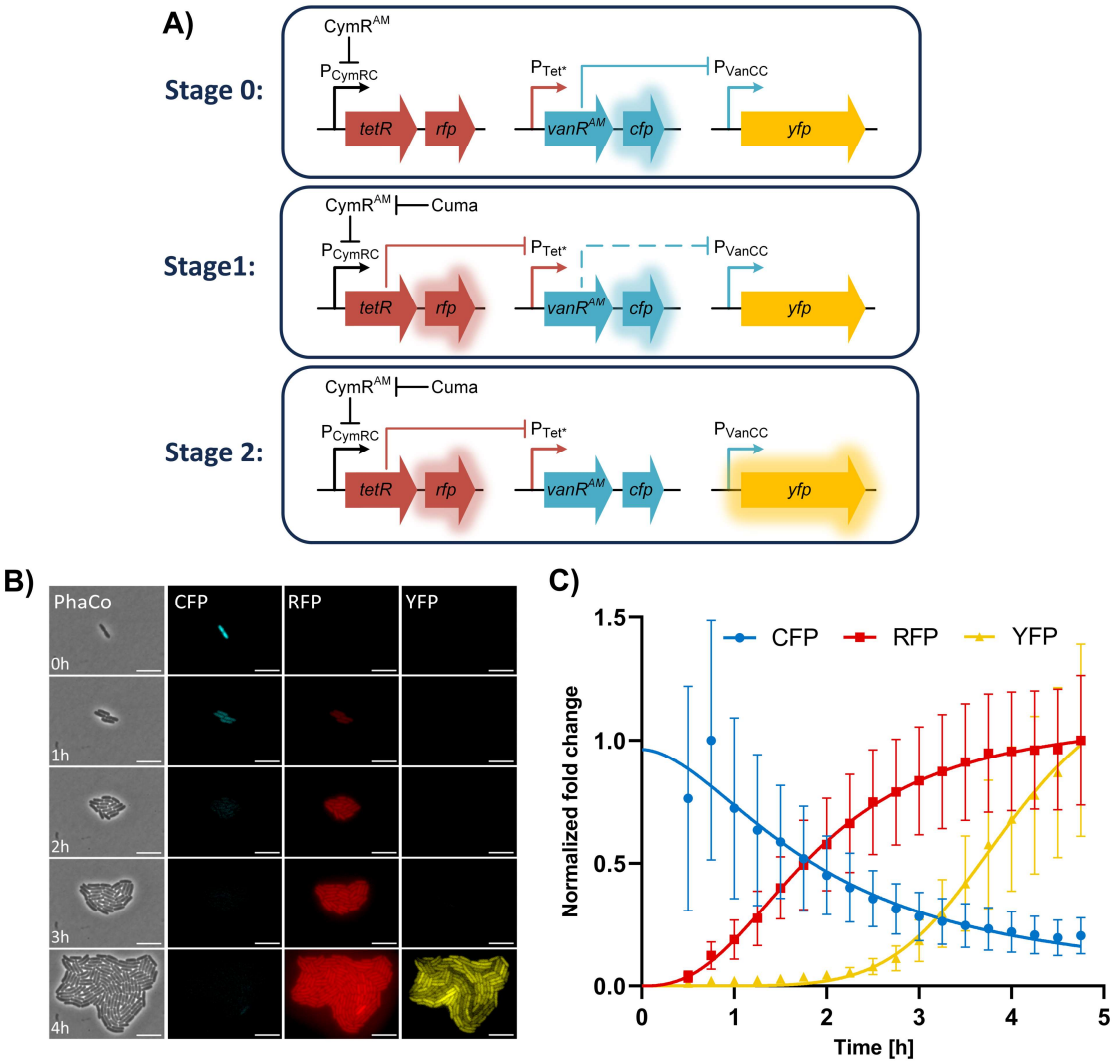

Figure 1: (A) Schematic illustration of the repressor cascade making up the autonomous timer circuit within *E. coli* MG1655 AT. (B) Representative time-lapse-fluorescence-microscopy image series of MG1655 AT induced with 100 µM Cuma (at t = 0 h) on agarose pads. Scale bars are 10 µm; PhaCo = Phase contrast; CFP = mCerulean3; RFP = mKate2; YFP = sYFP2. (C) Kinetics of the normalized fold change of average cellular CFP, RFP and YFP fluorescence in MG1655 AT cells grown on agarose pads and induced at t = 0 h with 100 µM Cuma. Growth of 59 single cells into ca. 100-cell microcolonies was monitored. The data depicts means of two independent experiments fitted with a hill function with error bars representing standard deviation based on cell-to-cell variance.

Functionalizing the autonomous timer circuit

Since our circuit performed as a robust timer, allowing for an autonomous and synchronous delay between two distinct stages, we proceeded with a functional proof-of-concept by imposing an MG1655 AT population with a time-resolved production-followed-by-lysis program via a single input (Fig. 2A). More specifically, a low copy number **t**imer **app**lication plasmid (i.e. pTApp) was constructed encoding (***i***) a P_{CymRC}-*crtEBI* circuit, conferring a lycopene production module, that via its P_{CymRC} promoter is coupled to Stage 1 activation, and (***ii***) a P_{VanCC}-*M4Lys* circuit, conferring a lysis module, that via its P_{VanCC} promoter is coupled to Stage 2 activation (Fig. 2B). While the *crtEBI* operon stems from *Erwinia herbicola* and enables lycopene production in *E. coli* from its natural farnesyl pyrophosphate intermediate (25), the *M4Lys* (or *ORF_38*) gene stems from the BSPM4 phage and enables lysis independently from the presence of holin or the Sec pathway (26).

As intended, when a batch culture of MG1655 AT equipped with pTApp was Cuma induced, it first started to accumulate lycopene for ca. 3 h (Stage 1), after which lysis and reduced viable cell count (Stage 2) autonomously set in (pTApp +Cuma in Fig. 2CDE). In fact, almost complete lysis occurred at 4 h post Cuma triggering, suggesting that time delayed expression of plasmid-based functionalization genes follow the same temporal profile as inferred from the TLFM-assayed fluorescent reporters (Fig. 1), despite the copy number difference of the pTApp plasmid (~9 copies/cell) (27) to the chromosomal YFP reporter. Therefore, the additional P_{VanCC} copies do not significantly titer $VanR^{AM}$ away, and the autonomous timer progression can be used as a temporal queue for pTApp performance. After lysis, the amount of lycopene that could be recovered from cell mass (at t = 5 h; Fig. 2D) was greatly reduced, indicating its release into the culture supernatant.

As a control, MG1655 AT cells were also locked in Stage 1 after Cuma induction by simultaneously providing aTc (pTApp +Cuma +aTc in Fig. 2CDE). This indeed allowed lycopene production to continue (and lycopene levels to increase) past 3 h without being followed by lysis (as P_{Tet*} repression and subsequent P_{VanCC} derepression were abolished). Moreover, when such Stage 1-fixed MG1655 AT cells were forced to proceed to Stage 2 by providing Van after 3 h (pTApp +Cuma +aTc +Van in Fig. 2CDE), they displayed virtually similar lysis and viability dynamics as the autonomously operating pTApp +Cuma population. These same dynamics could also be visually observed as indicated by

representative pictures of the cultures after 5 h of incubation in flasks (Fig. 2F). While all Cuma induced cultures had a characteristic pink colour, only the conditions allowing to progress to Stage 2 revealed massive cell lysis.

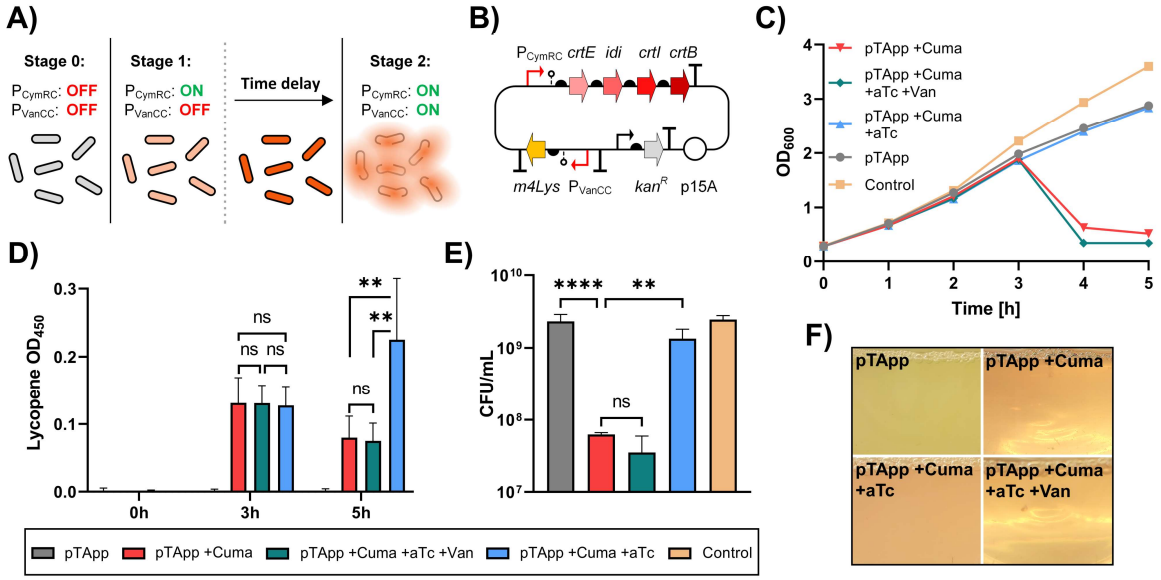

Figure 2: Functionalisation of the repressor cascade-based autonomous timer circuit within *E. coli* MG1655 AT. (A) Schematic illustration of the intended time-resolved production-followed-by-lysis program via a single (Cuma) input. (B) Scheme of the pTApp plasmid harbouring both the P_{CymRC}-*crtEBI* circuit (for lycopene production) and the P_{VanCC}-*M4Lys* circuit (for subsequent lysis) that serve to functionalize the timer circuit. (C) Kinetics of OD_{600} at indicated time points during batch cultivation of MG1655 AT equipped either without (control) or with pTApp, and the latter being non-induced (pTApp), induced with 100 µM Cuma at t = 0 h (pTApp +Cuma; displaying autonomous timer progression), induced with 100 µM Cuma and 200 nM aTc at t = 0 h (pTApp +Cuma +aTc; fixing the timer at Stage 1), or induced with 100 µM Cuma and 200 nM aTc at t = 0 h and 100 µM Van at t = 3 h (pTApp +Cuma +aTc +Van; imposing transition from Stage 1 to Stage 2 at 3 h). At t = 0 h, 3 h and 5 h of growth, lycopene content of indicated strains was assayed using the plasmid free control as a blank (D). At t = 5 h viable cell count (CFU/ml) was determined (E), and representative photographs were taken of indicated strains (F). For (D) and (E), means and standard deviations of two independent repetitions are shown. For (C) representative results of two independent repetitions are shown.

Since the sequentially expressed functionalisation pathways are located on a small low copy number plasmid harbouring insulated low leakiness promoters form the Marionette Sensor Collection (18,27), the pTApp system is modular and orthogonal to the chromosomal timer. It therefore also allows for gene functions on pTApp to be replaced without the risk of significantly altering timer performance.

Chemical tuning of the autonomous timer circuit

To further establish the versatility of the autonomous timer circuit, we examined how easily the delay between Stage 1 and Stage 2 could be tuned. In fact, varying the background concentrations of aTc or Van should affect the time it takes to repress P_{Tet*} (directly correlated with aTc concentrations) or to derepress P_{VanCC} (inversely correlated with Van concentrations), respectively (Fig. 3A).

As shown in Fig. 3B, emergence of YFP (as a proxy of Stage 2 activation) can indeed be expedited in the presence of Van and delayed in the presence of aTc. In fact, while 1.6 μM or 3 μM of Van fails to significantly derepress P_{VanCC} when $VanR^{AM}$ is constitutively expressed and replenished (cfr. Fig S1), these concentrations do manage to rapidly attenuate $VanR^{AM}$ activity during the cytoplasmic dilution of this repressor. Overall, the delay (measured as the time after Cuma triggering at which the average cellular YFP expression surpasses the basal level of the non-induced controls 10-fold) of the timer circuit could be tuned between 1.9 h (in the presence of 3 μM Van) and 4.4 h (in the presence of 60 nM aTc; Fig. 3C). Since the doubling time of MG1655 AT remained stable at ca. 38 min throughout all tested conditions, it can also be stated that Stage 2 activation can be chemically tuned to occur anywhere within a range of 3 to 7 cell divisions.

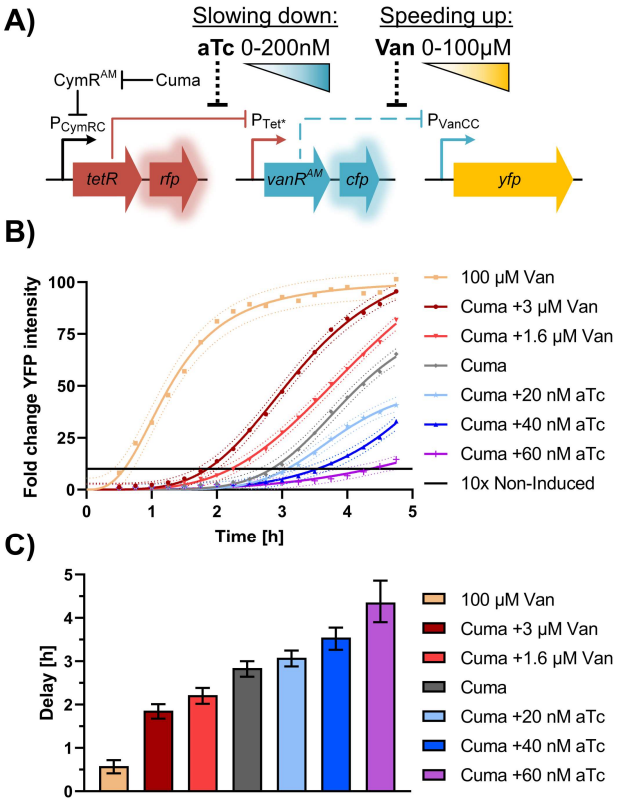

Figure 3: Chemical tuning of the autonomous timer circuit. (A) Schematic overview of aTc and Van-based tuning of the autonomous timer circuit. (B) Kinetics of the fold change of average cellular YFP fluorescence of MG1655 AT grown on agarose pads under indicated timer tuning conditions and induced at t = 0 h with 100 µM Cuma, relative to similarly grown MG1655 AT cells without induction. The black line is set at 10-fold the basal YFP intensity level of the non-induced control. The data of two independent repetitions was fitted with a hill function with errors indicated though 95% prediction intervals. The mean of every datapoint is represented by the respective symbols. For each condition, growth of ca. 60 single cells into ca. 100-cell microcolonies was monitored. (C) Delay in YFP expression estimated by the time it takes for the fitted data in panel B to reach 10-fold the basal YFP intensity level of the non-induced control (i.e. black line in panel B). Error bars indicate the variance by which the upper and lower end of the 95% prediction interval cross the threshold.

Construction and validation of an asynchronous autonomous timer circuit

In order to further our abilities to impose a differential but still deterministic timing within bacterial populations, the autonomous timer circuit was adapted so that (***i***) *tetR* became replaced with *bxb1* (encoding the Bxb1 irreversible recombinase) and (***ii***) the P_{Tet*}-*vanR*^{AM}-*cfp* fragment became flanked with Bxb1 recognition sites. The resulting circuit now allows for Cuma-triggering of Bxb1 activity that physically excises the P_{Tet*}-*vanR*^{AM}-*cfp* fragment ("VanR fragment") from the chromosome and turns it into a circular non-replicating plasmid that inevitably segregates asymmetrically upon cell division (Fig. 4A). Moreover, the circuit was designed so that Bxb1-mediated excision also reconstitutes P_{CymRC} mediated *rfp* expression that is otherwise disrupted by the antisense oriented integrated VanR-fragment and its terminators, allowing the timing of successful excision to be readily reported by RFP fluorescence. Upon each division, cells containing the excised P_{Tet*}-*vanR*^{AM}-*cfp* plasmid (referred to as VanR carrier cells) will give rise to a new VanR carrier daughter cell and a daughter cell lacking the P_{Tet*}-*vanR*^{AM}-*cfp* circuit. Since these latter cells thus lack the genetic information to replenish VanR^{AM}, they will upon further proliferation experience the progressive dilution of cytoplasmically inherited VanR^{AM} and eventual de-repression of P_{VanCC} (reported by YFP; Fig. 4B). As such, the generational distance of daughter cells from respective VanR carrier cells (i.e. the time since spawning off from a cell expressing VanR^{AM}) now is the sole queue for delayed Stage 2 activation (Fig. 4B). The resulting

E. coli MG1655 strain harbouring this **a**synchronous **a**utonomous **t**imer circuit is further referred to as MG1655 AAT.

Figure 4C shows a representative microcolony stemming from a single Cuma-induced MG1655 AAT cell (cfr. Fig. S2 for all time points). Even 5 h after circuit induction, cells can still be readily seen in all stages of circuit progression. While cells harbouring the VanR fragment are bright CFP fluorescent, their daughter cells lose this fluorescence and in time become YFP fluorescent within a couple of generations. Therefore, the excised VanR fragments are quite stable and spur continuous temporal dynamics, leading to a predictable establishment of population heterogeneity. Furthermore, the memory effect of recombinases allows for the asynchronous autonomous timer to also be triggered by only pulsing Cuma for 1 h prior to microscopic monitoring on non-inducing pads. Due to the pulsed head start in Bxb1 expression, the resulting microcolonies tend to harbour only one excised VanR fragment, while also showing no RFP fluorescence, since without Cuma, P_{CymRC} is in its repressed state again (Fig. 4D).

Due to the apparent stability of the excised VanR-fragment, it is asymmetrically inherited over many generations, thereby allowing the differentiation dynamics to continue over many hours. Although eventually fully differentiated cells tend to take over the population, this aspect could be quenched or alleviated by introducing terminal differentiation in Stage 2.

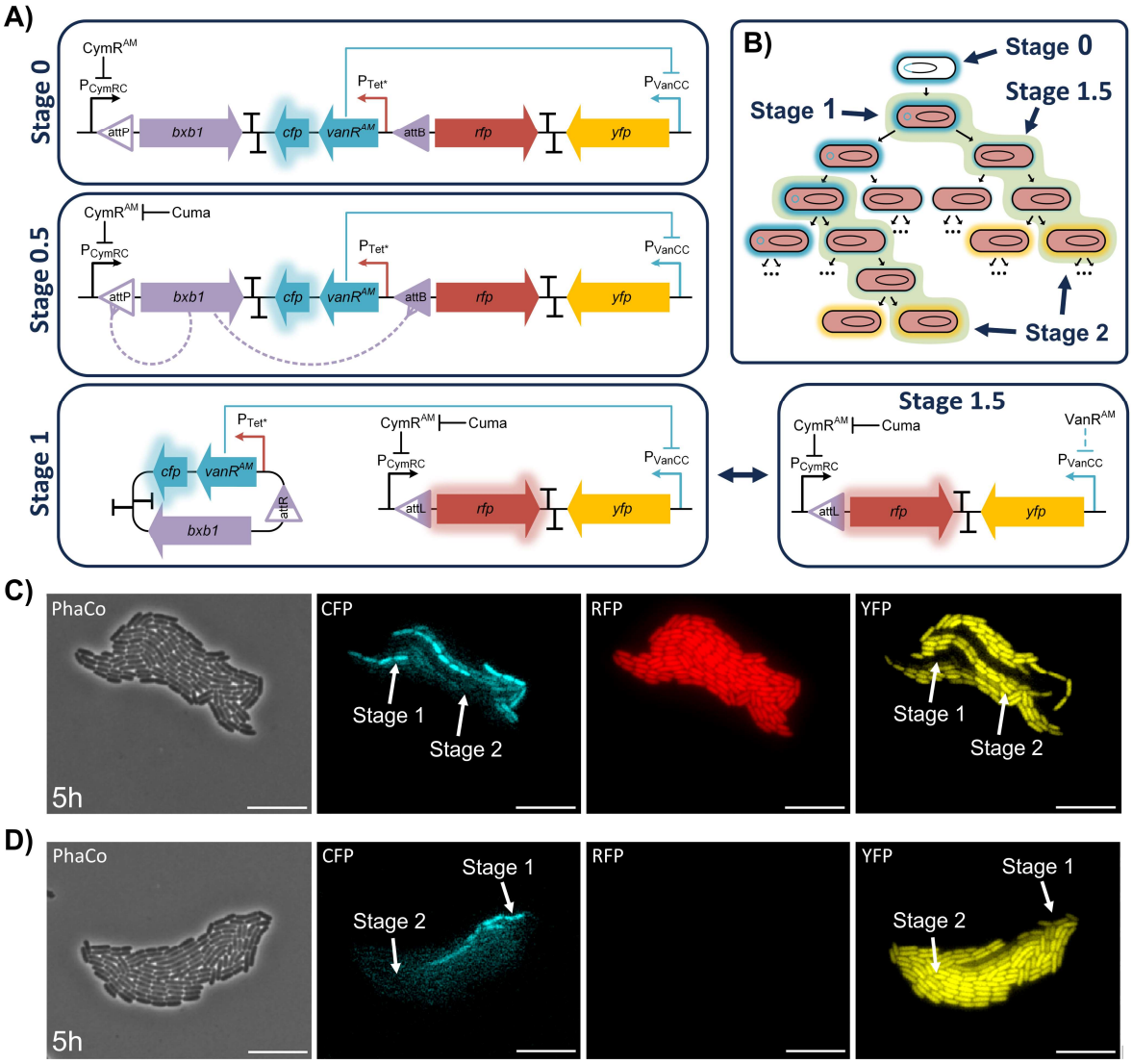

Figure 4: Schematic overview of the asynchronous autonomous timer circuit. (A) Stages involved in the circuit progression. (B) Population based overview of the asynchronous autonomous timer progression in cells spawning off from VanR carrier cells. (C) Microscopy image displaying CFP, RFP and YFP fluorescence of a MG1655 AAT microcolony starting from a single cell exposed to 100 mM Cuma at t = 0 h. (D) Same conditions as in panel C, but pre-induced with 100 µM Cuma for one hour only prior to microscopy under non-inducing conditions. Scale bars are 10 µm; PhaCo = Phase contrast; CFP = mCerulean3; RFP = mKate2; YFP = sYFP2.

Conclusion

In summary, we could show that the temporal dynamics of logic gates can be engineered and exploited for the autonomous relay of time-resolved instructions to bacterial populations. The elaborated timer-tools allow to program cells for stepwise division-of-labor behavior over a desired timeframe (i.e. switching from one task to the next), and even to divide tasks between isogenic sister cells in a predictable fashion. As such, these tools provide new handles to program complex behaviors in microbial populations that can be useful in bioprocessing and microbial therapy.

Acknowledgments

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Supplementary data

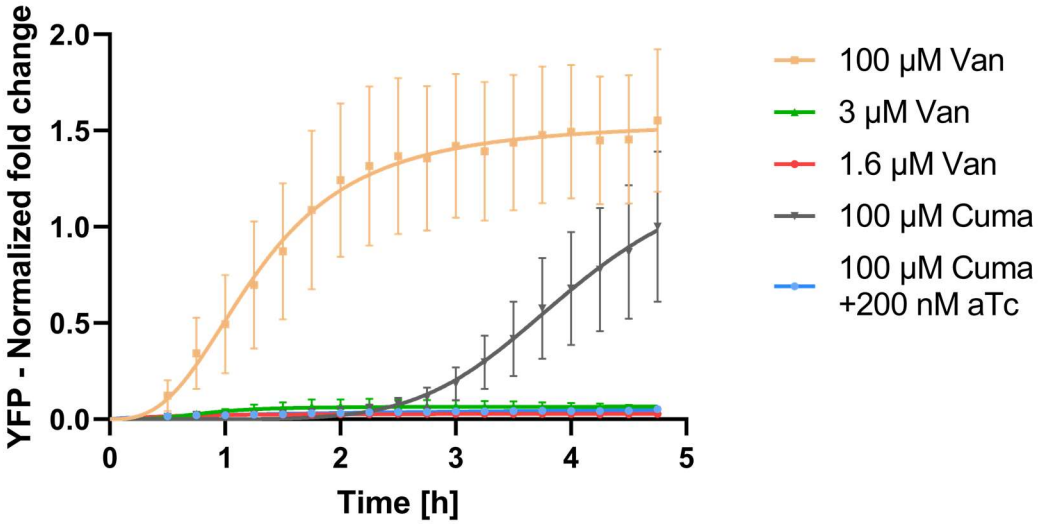

Figure S1: Kinetics of the normalized fold change of average cellular YFP fluorescence in MG1655 AT cells grown on agarose pads and induced at t = 0 h with indicated inducers and concentrations. For each condition, growth of ca 54 single cells into ca. 100-cell microcolonies was monitored. The data depicts means of two independent experiments fitted with a hill function with error bars representing standard deviation based on cell-to-cell variance.

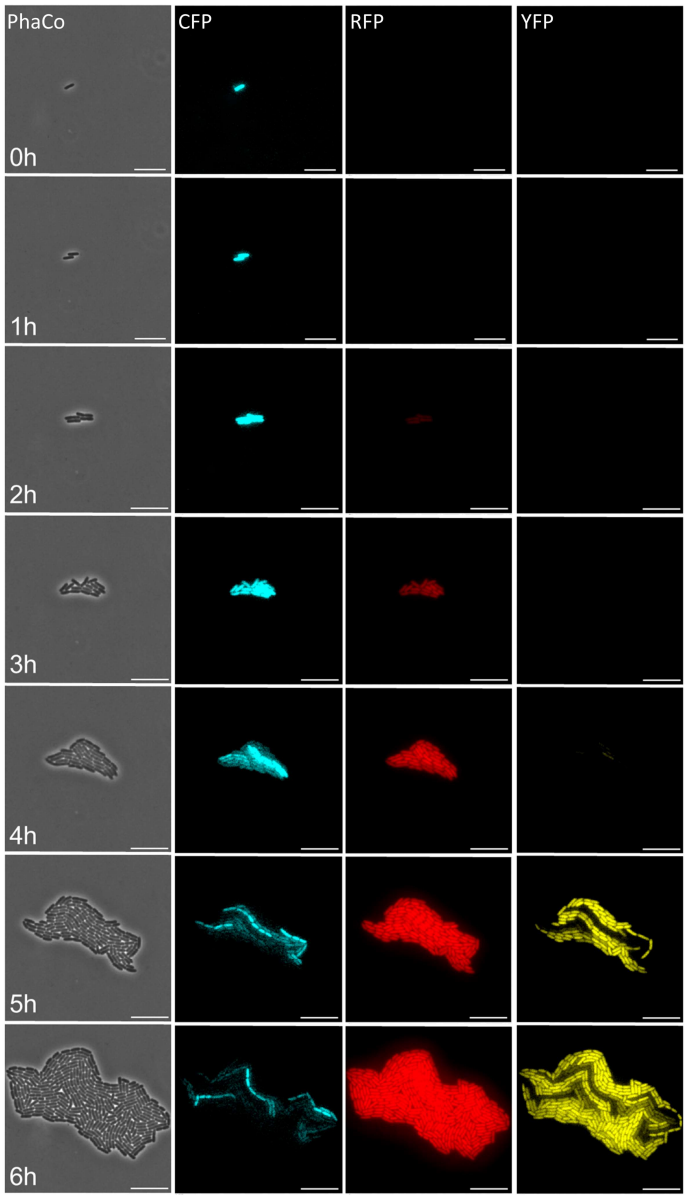

Figure S2: Representative time-lapse-fluorescence-microscopy image series of a MG1655 AAT microcolony induced with 100 µM Cuma (at t = 0 h) on the agarose pad. Scale bars are 10 µm; PhaCo = Phase contrast; CFP = mCerulean3; RFP = mKate2; YFP = sYFP2