

Discrete gene replication events drive coupling between the cell cycle and circadian clocks

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Many organisms possess both a cell cycle to control DNA replication and a circadian clock to anticipate changes between day and night. In some cases, these two rhythmic systems are known to be coupled by specific, cross-regulatory interactions. Here, we use mathematical modeling to show that, additionally, the cell cycle generically influences circadian clocks in a nonspecific fashion: The regular, discrete jumps in gene-copy number arising from DNA replication during the cell cycle cause a periodic driving of the circadian clock, which can dramatically alter its behavior and impair its function. A clock built on negative transcriptional feedback either phase-locks to the cell cycle, so that the clock period tracks the cell division time, or exhibits erratic behavior. We argue that the cyanobacterium *Synechococcus elongatus* has evolved two features that protect its clock from such disturbances, both of which are needed to fully insulate it from the cell cycle and give it its observed robustness: a phosphorylation-based protein modification oscillator, together with its accompanying push-pull read-out circuit that responds primarily to the ratios of different phosphoform concentrations, makes the clock less susceptible to perturbations in protein synthesis; the presence of multiple, asynchronously replicating copies of the same chromosome diminishes the effect of replicating any single copy of a gene.

Kai | circadian rhythms | cell cycle | oscillations | simulation

Circadian clocks—autonomous oscillators with a roughly 24-h period that can be entrained to daily cycles of light and dark—are thought to confer important advantages on living cells by allowing them to anticipate diurnal environmental changes. Recent decades have seen considerable progress in elucidating both the architecture and the function of these biological timekeepers. Circadian clocks, however, are not the only oscillatory systems present in living cells. Most notably, cell growth and division are governed by a cell cycle, which can in many contexts be viewed as an autonomous oscillator. Much recent attention has been directed toward the connections between these two rhythmic systems, which are relevant for processes ranging from plants' response to shade (1) to cancer susceptibility (2, 3). In particular, it is now clear that circadian clocks can exert specific regulatory influences on the cell cycle, and a number of experimental and modeling studies have sought to tease out the implications of this regulation (4–11). Here, we argue that, in addition to direct, specific regulation of one oscillator by the other, there must also be more generic connections between the circadian clock and the cell cycle (2, 10–12). In particular, we focus on the consequences of the discrete gene replication events that accompany DNA replication. We show that, as a result of the regular jumps in gene copy number caused by these events, the cell cycle must, very generally, contribute a periodic forcing to the circadian clock. This forcing can markedly change clock behavior and degrade clock function. We propose that cyanobacterial clocks have evolved specific features that can mitigate this effect. More broadly, this generically strong coupling to the cell cycle implies important constraints on the design of biological timekeepers if they are to remain accurate in dividing cells.

It is widely accepted that protein levels depend on a cell's gene dosage. Typically, a doubling of the number of chromosomal copies of a gene should lead to an approximate doubling of its

mRNA synthesis rate and thus to a corresponding increase in its protein levels. Most often, however, such effects are considered in the context of a change in the number of autosomal gene copies that persists throughout an organism's lifetime (13), as, for example, in the haploinsufficiency of certain genes (14). It is less often acknowledged that the number of copies of all genes varies over each cell cycle, despite evidence that these variations have measurable consequences (15–18). Because of the well-known phenomenon of phase-locking of oscillators (19), regular, periodic changes in gene dose are likely to be especially relevant to cellular oscillators that depend on gene expression. A circadian clock that became slaved to the cell cycle, for example, would lose its identity as an autonomous timekeeper, and thus much of its ability to perform its biological function. Here, we show that negative transcriptional feedback oscillators (NTFOs)—a common motif in both prokaryotic and eukaryotic clocks—are indeed very strongly affected by driving from periodic gene replication events. This immediately raises the question of how real biological clocks are able to function in growing, dividing cells. To address this, we study the circadian clock of the cyanobacterium *Synechococcus elongatus*, which is known to exhibit stable rhythms over a wide range of growth rates (20, 21), but whose clock seems not to regulate DNA replication (4), suggesting exactly the sort of unidirectional forcing of the clock by the cell cycle that might have been expected to impair clock function.

The *S. elongatus* clock combines an NTFO (the transcription-translation cycle, or TTC) with a core phosphorylation-based posttranslational oscillator (the protein phosphorylation cycle, or PPC). Remarkably, the PPC can be reconstituted in vitro with the purified cyanobacterial clock proteins KaiA, KaiB, and KaiC (22), allowing detailed study of the mechanisms behind its

Significance

Huygens famously showed that two mechanically connected clocks tend to tick in synchrony. We uncovered a generic mechanism that can similarly phase-lock two rhythmic systems present in many living cells: the cell cycle and the circadian clock. DNA replication during the cell cycle causes protein synthesis rates to show sharp, periodic jumps that can entrain the clock. To faithfully keep time in the face of these disturbances, circadian clocks must incorporate specific insulating mechanisms. We argue that, in cyanobacteria, the presence of multiple, identical chromosome copies and the clock's core protein-modification oscillator together play this role. Our results shed new light on the complex factors that constrain the design of biological clocks.

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oscillation. A number of studies have begun to converge on the view that the PPC works by synchronizing the intrinsic phosphorylation cycles of individual KaiC hexamers, primarily through phosphorylation-dependent sequestration of KaiA by KaiC (23–29). Although many details of the TTC remain murkier, it seems clear that the protein RpaA plays a central role, regulating the expression of clock components in a manner that ultimately reflects the KaiC phosphorylation state (30–34). Depending on light and nutrient levels, *S. elongatus* can have doubling times ranging from 6 to 72 h (21); the cell-cycle period is thus of the same order as the clock period of roughly 24 h, opening the way for interactions between the two. Indeed, the circadian clock is known to gate mitosis, prohibiting cell division during certain clock phases (4, 7, 8), although in constant light this gating leaves both DNA replication and cell growth essentially unchanged (4). Conversely, Mori and Johnson (20) argued that cell growth and division do not affect the *S. elongatus* circadian clock. We use mathematical modeling to study the unidirectional forcing of the clock by the cell cycle. We identify specific features of the *S. elongatus* clock that tend to insulate it from entrainment by regular gene replication events. Nonetheless, we argue that, under certain conditions, it should be possible to observe signatures of periodic forcing of the clock by the cell cycle. We further suggest how some of the clock's protective mechanisms might be weakened experimentally, leading to much stronger signatures of its coupling to the cell cycle.

Below, we first model the effects of cell growth and division on a constitutively expressed protein. We show that gene replication, not cell division, is the essential cell-cycle event that influences protein concentrations and that, as long as the constitutively expressed protein is not subject to rapid, active degradation, its concentration varies little over the cell cycle. In contrast, gene replication can dramatically affect the behavior of an NTFO: The NTFO locks to the cell cycle over a range of cell-division times of many hours and shows erratic behavior outside this regime (12). We next ask how the real cyanobacterial clock can be so apparently undisturbed by the cell cycle. We find that incorporating both a PPC and a TTC into the clock significantly weakens coupling to the cell cycle, especially when the clock is read out by a push–pull network that is more sensitive to ratios of concentrations of different phosphorylation states than to their absolute values. The presence of multiple chromosome copies has a still more striking effect: If the cell has four copies after division (rather than only one), as can often be the case in *S. elongatus*, and if these are replicated one after the other (35), then the dose of the clock genes changes much more gradually, and cell-cycle effects are almost completely lost. Thus, *S. elongatus* may have evolved to carry multiple, identical chromosome copies in part to insulate its circadian clock from its DNA replication cycles.

Models and Results

The Cell Cycle's Effect on a Constitutively Expressed Gene Is Weak. Before turning to the more complex case of a circadian clock, we first investigate how the concentration of a single, constitutively expressed protein varies over a cell cycle. To this end, we add regular, rhythmic DNA replication and mitosis to a simple model of protein production and dilution.

The key quantities in our description are the number of copies $g(t)$ of the gene of interest and the cell volume $V(t)$. These vary periodically in time as sketched in Fig. 1 *A* and *B*, with a period given by the cell division time T_d . We assume for now that there is only one gene copy present immediately after cell division. This copy is replicated at some time before the next division, at which point $g(t)$ jumps from 1 to 2. When the cell divides, the chromosomes are split between the daughter cells, and $g(t)$ returns to 1. The cell volume grows exponentially: $V(t) = V_0 \exp(\mu_d t)$, with $\mu_d = \log(2)/T_d$. When t reaches T_d , division occurs, and $V(t)$ drops back from $2V_0$ to V_0 .

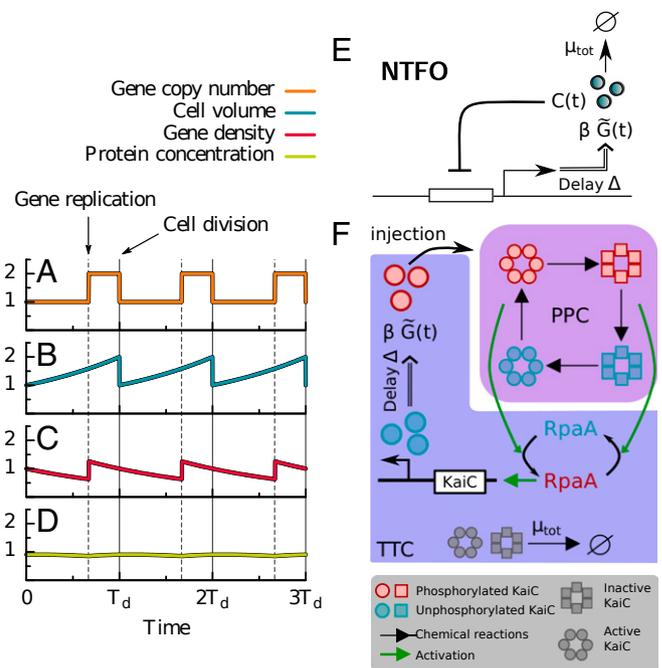


Fig. 1. DNA replication, but not cell division, affects average expression levels; for a protein that is constitutively expressed and decays by dilution only, the effect is small. Schematic time courses of the gene copy number $g(t)$ (*A*), the cell volume $V(t)$ (*B*), the gene density, $G(t) = g(t)/V(t)$ (*C*), and the concentration $C(t)$ of a constitutively expressed protein that decays only by dilution (*D*). Time in units of the cell division time T_d ; vertical axes, arbitrary units. The gene density (*C*) has a discontinuity when the gene is replicated (vertical dotted lines) but not at cell division (vertical solid lines), when both $g(t)$ and $V(t)$ are halved. Even though the protein synthesis rate doubles when the gene is replicated, the maximum deviation of $C(t)$ from its time average is less than 4% (*D*). (*E*) The NTFO model: A protein with concentration $C(t)$ represses its own transcription with a delay Δ . (*F*) Zwicker et al. (36) model for coupled phosphorylation (PPC, purple background) and transcription–translation (TTC, blue background) cycles. KaiC hexamers switch between an active conformational state (circles) in which their phosphorylation level tends to rise and an inactive state (squares) in which it tends to fall. Active KaiC activates RpaA and inactive KaiC inactivates RpaA; active RpaA (red) activates *kaiBC* expression, leading (after a delay) to the injection of fully phosphorylated KaiC (pink) into the PPC.

The variables $g(t)$ and $V(t)$ define the gene density $G(t) \equiv g(t)/V(t)$. As long as noise and spatial variations are neglected, the behavior of a biochemical network depends only on protein concentrations, not separately on protein numbers and cell volume. As a result, the system responds to the protein synthesis rate per unit volume, proportional to $G(t)$, but not to $g(t)$ and $V(t)$ individually (Eq. 1). Fig. 1*C* shows that $G(t)$ has only a single discontinuity during the cell cycle, corresponding to the doubling of $g(t)$ when the gene is copied; at cell division, both $g(t)$ and $V(t)$ are halved, so their ratio is unchanged. Importantly, then, the mean-field, deterministic dynamics of a biochemical network is sensitive to the timing of DNA replication but not of cell division. This dynamics is likewise unaffected by any gating of cell division by the circadian clock, provided, as is the case in *S. elongatus* (4, 8), that this gating does not affect DNA replication or cell growth. Similarly, regardless of when during the division cycle the gene is copied, the time dependence of $G(t)$ is always the same: It doubles, decays exponentially for a time T_d , then doubles again, and so on. The exact moment of gene replication affects only the average value of $G(t)$, which can be absorbed, for modeling purposes, into the parameter β (Eq. 1). For simplicity, we thus always assume that the gene is replicated exactly at $t = T_d/2$.

Given the gene density $G(t)$, the concentration $C(t)$ of a constitutively expressed protein evolves as

$$\frac{dC(t)}{dt} = \beta G(t) - \mu_d C(t). \quad [1]$$

Here, proteins are expressed at a rate β per gene copy and diluted by cell growth at a rate $\mu_d = \log(2)/T$. We thus assume that, as is true for many bacterial proteins, the protein is not subject to active degradation (37). Fig. 1D shows how $C(t)$ varies over the cell cycle. Remarkably, even though the protein production rate doubles each time the gene is replicated, the protein concentration varies by no more than a few percent: The discrete jumps in protein production are smoothed out by the slow protein dilution. Thus, a protein that is constitutively expressed and not actively degraded is little affected by the cell cycle.

The Cell Cycle Strongly Perturbs Both the Period and the Amplitude of an NTFO. Although the concentration of a protein that is constitutively expressed does not vary much over the cell cycle, oscillators are known to be far more sensitive to periodic driving than nonoscillatory systems (19). We thus next consider a simple model for a clock built on delayed, negative transcriptional feedback (Fig. 1E). The model consists of a single variable, $C(t)$, describing the concentration of proteins that inhibit their own production:

$$\frac{dC(t)}{dt} = \beta \tilde{G}(t) \frac{K_c^n}{K_c^n + C(t - \Delta)^n} - \mu_{\text{tot}} C(t). \quad [2]$$

We impose a fixed delay Δ between the initiation of transcription and the appearance of functional proteins. Therefore, protein production at time t is proportional to the gene copy number $g(t - \Delta)$ at time $t - \Delta$. These proteins “arrive” in the cell volume $V(t)$ at time t . The protein synthesis rate per unit volume at time t is thus proportional to the protein production density $\tilde{G}(t) \equiv g(t - \Delta)/V(t)$. $\tilde{G}(t)$ is a generalization of the gene density $G(t)$ of the preceding section to the case with a delay Δ and parameterizes the periodic forcing of the NTFO by gene replication. Proteins disappear with a total rate $\mu_{\text{tot}} = \mu_d + \mu_{\text{act}}$, where as before μ_d describes dilution due to cell growth and μ_{act} describes possible active degradation. Including both terms allows us to vary the doubling time T_d while holding μ_{tot} constant and hence, in our simulations, to distinguish the trivial influence of the cell cycle on the clock through the dilution rate μ_d from other effects.

We next define the peak-to-peak time T_{PTP} as the time between successive peaks in $C(t)$ (Fig. 2 and [Supporting Information](#)); T_{PTP} reduces to the period of the circadian clock when oscillations are regular but remains defined when the cell cycle induces more erratic behavior. In Fig. 2A we plot the average peak-to-peak time ($\langle T_{\text{PTP}} \rangle$) for a range of division times T_d at fixed μ_{tot} .

As expected from the general theory of driven oscillators (19), the curve shows two striking features. First, around division times that are fractions or multiples of the clock’s intrinsic period of 24 h, the cell cycle determines the period of the clock. Especially around $T_d = 24$ and 48 h, the average peak-to-peak time is directly proportional to T_d . At $T_d = 24$ h (1:1 locking), $\langle T_{\text{PTP}} \rangle = T_d$, and the amplitude of each clock oscillation cycle is the same (Fig. 2B). At $T_d = 48$ h (2:1 locking), however, $\langle T_{\text{PTP}} \rangle = T_d/2$, and two full clock cycles are required to make up a single division time. Because these two cycles occur at different gene densities, successive peaks in the trace of $C(t)$ have alternately large and small amplitudes.

Second, the standard deviation (SD) of T_{PTP} becomes very large just outside the locking regions. Fig. 2C shows that this variability in the phase of $C(t)$ is accompanied by substantial fluctuations in the amplitude for $T_d = 27$ h. Because the difference between T_d and

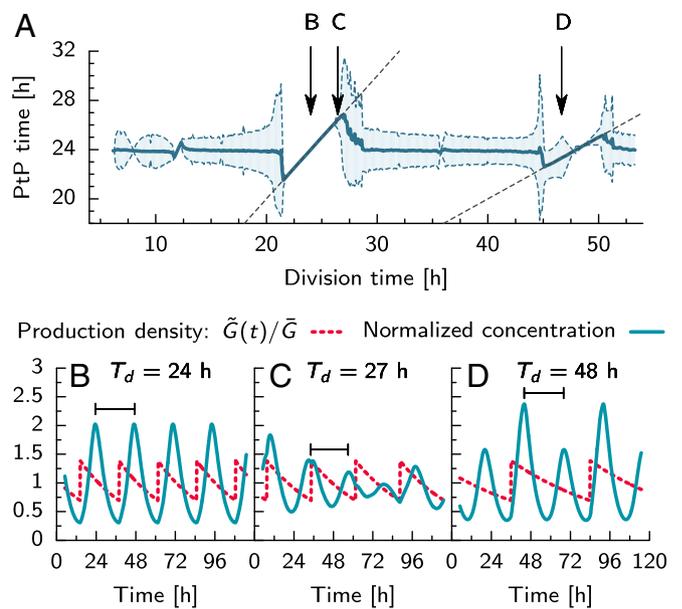


Fig. 2. Periodic gene replication dramatically affects an NTFO. (A) The average peak-to-peak time ($\langle T_{\text{PTP}} \rangle$) (solid curve) versus the cell division time T_d at fixed μ_{tot} and β . The shaded region shows the SD of the peak-to-peak times ([Supporting Information](#)). Dashed lines indicate regions where the clock locks to the cell cycle with periods in a 1:1 (left) or 2:1 (right) ratio. (Smaller locking regions around $T_d = 6, 12$, and 36 h are not marked.) (B–D) Protein concentration $C(t)$ (blue solid line) and the protein production density $\tilde{G}(t) = g(t - \Delta)/V(t)$ (red dashed line) for the values of T_d indicated by the arrows in A; horizontal brackets in B–D illustrate the definition of the peak-to-peak time T_{PTP} . At $T_d = 24$ h (B), the clock locks firmly to the cell cycle. For $T_d = 27$ h (C), the cell-cycle period is just too large for locking; as a result, the cell cycle dramatically disrupts the clock, leading to a large SD of T_{PTP} (see A). At $T_d = 48$ h (D), two oscillation cycles of the NTFO fit exactly in one division time. The larger-amplitude oscillation cycle corresponds to cell-cycle phases where $\tilde{G}(t)$ is higher and the smaller amplitude to phases where $\tilde{G}(t)$ is lower. Similar results are obtained upon varying T_d at constant μ_{act} (Fig. S8).

the intrinsic clock period is just too large to allow stable locking, the clock constantly tries to lock to the cell cycle, but slips from time to time. As a result, the cell cycle dramatically disrupts the clock. In [Supporting Information](#) we show that both of these effects survive the introduction of intrinsic noise in chemical reactions and of stochasticity in the timing of DNA replication (Figs. S1 and S2; see also Fig. S3). Fig. 3 qualitatively explains how locking arises in the NTFO.

A Phosphorylation Cycle Makes the Clock More Robust Against a Time-Varying Gene Density. To study how a more realistic clock can become resilient to variability in the gene density, we turn to the *S. elongatus* circadian clock, and more specifically to the model of Zwicker et al. (25, 36) (Fig. 1F). This model provides a detailed description of the clock, including the synchronization of the phosphorylation state of different KaiC hexamers via KaiA sequestration and the coupling of the PPC oscillator to the TTC via RpaA. It represents KaiC as a hexamer but does not explicitly take into account that each KaiC monomer has two distinct phosphorylation sites (26, 38). In [Supporting Information](#) we show that a model based on that of Rust et al. (26), which describes KaiC at the level of monomers with two phosphorylation sites, gives similar results (Fig. S4). We thus expect that still more elaborate models of the PPC, which include hexameric KaiC with two phosphorylation sites per monomer (29), will lead to similar results. To include gene replication, we modify the model of ref. 36 so that the delayed negative feedback on KaiC production is modulated by a regularly oscillating protein production density $\tilde{G}(t)$ ([Supporting Information](#)). We follow both the total

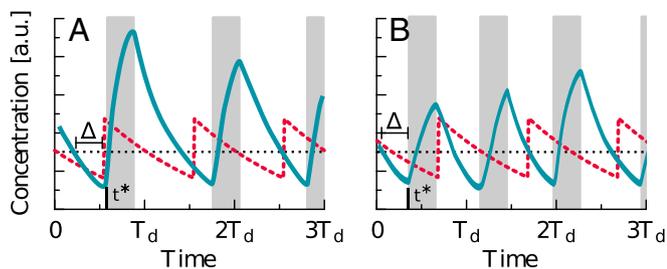


Fig. 3. Locking mechanism for the NTFO. Shown are time courses of the production density $\bar{G}(t) = g(t - \Delta)/V(t)$ (dashed red lines) and the protein concentration $C(t)$ (solid blue lines). For clarity, we consider the limit $n \rightarrow \infty$, in which the Hill function describing autoregulation (Eq. 2) reduces to a step function with repression threshold K_c , denoted by the dotted horizontal line. Shaded regions indicate times when $C(t)$ is rising. The panels correspond to two different initial phase differences between the NTFO and the cell cycle. In each case, when $C(t)$ drops below K_c at time $t^* - \Delta$, protein production starts, but because of the delay Δ , new molecules are injected into the system only at time t^* . (A) The gene has replicated just before $t^* - \Delta$, and $\bar{G}(t^*)$ is hence large, yielding a large amplitude for the next NTFO cycle. Because the rate of protein decay is independent of $\bar{G}(t)$, the period of the NTFO cycle is correspondingly long. The subsequent NTFO cycle thus begins at smaller $\bar{G}(t^*)$, causing it to have a smaller amplitude and a shorter period. (B) The gene has not yet replicated at time $t^* - \Delta$, and $\bar{G}(t^*)$ is therefore low; consequently, the amplitude and period of the next NTFO cycle are small. The beginning of the subsequent cycle is then shifted toward higher $\bar{G}(t^*)$, increasing its period. In both cases, the result is that, after a few cell cycles, the period of the NTFO oscillation approaches that of the cell cycle, yielding stable 1:1 locking where the two oscillators have a well-defined phase relation. The largest amplitude and thus longest possible clock period arise when the protein synthesis phase (gray bar) coincides with the maximal $\bar{G}(t^*)$; if T_d increases beyond this maximal period, locking cannot occur. An analogous loss of locking occurs if T_d decreases below the minimal possible clock period. In either case, the clock shows erratic behavior until T_d approaches values where 1:2 or 2:1 locking is possible.

KaiC concentration $C_{\text{tot}}(t)$ and the KaiC phosphorylation fraction $p(t) = \sum_{n=1}^6 nC_n(t)/(6C_{\text{tot}}(t))$, where C_n is the concentration of n -fold phosphorylated KaiC hexamers.

Fig. 4A shows that a model with a PPC coupled to a TTC has a smaller locking window than an NTFO and lacks the large deviations in T_{PP} just outside the locking region. The *S. elongatus* clock is hence more robust to gene replication than one based only on negative transcriptional feedback.

Clock Readout Through an RpaA-Based Push-Pull Network Filters Out Cell-Cycle-Dependent Variations in Protein Concentrations. Although the variance of T_{PP} outside of the locking region is relatively small for the combined TTC-PPC model, Fig. 4B shows that $C_{\text{tot}}(t)$ exhibits strong amplitude fluctuations, mirroring those observed for the NTFO (Fig. 2). The phosphorylation fraction $p(t)$, in contrast, is far more resilient, suggesting that the clock encodes temporal information more reliably in $p(t)$ than in $C_{\text{tot}}(t)$. Intriguingly, the RpaA-centered push-pull network that transmits this timing signal to downstream genes (30–34, 39) in fact responds primarily to $p(t)$: Because the rates of RpaA phosphorylation and dephosphorylation are indirectly controlled by different KaiC phosphoforms, variations in C_{tot} at fixed p change both rates together, leaving the fraction of phosphorylated RpaA largely unaffected. In contrast, changes in p shift the balance between the two opposing reactions and so modify the RpaA phosphorylation fraction (Fig. S5 and Supporting Information). Thus, not only is the basic PPC-based timekeeping mechanism insulated from variations in protein synthesis, but the readout mechanism selectively follows this more robust signal.

Multiple Chromosome Copies Weaken the Cell Cycle's Influence on the Clock. Although the PPC reduces gene replication's effect on the clock, it does not eliminate it entirely (Fig. 4). What other mechanisms might explain the observed resistance of the

S. elongatus clock to the cell cycle? It is known that *S. elongatus* has multiple, identical copies of its chromosome (35, 40–42). These are not duplicated simultaneously, but rather one at a time, so that DNA replication occurs at a roughly constant rate throughout the cell cycle; furthermore, the timing of chromosome duplication seems to be independent of the phase of the clock (4, 35, 40, 42, 43). Motivated by this observation, we consider a cell that starts with N chromosomes after division and let $g(t)$ rise to $2N$ in N evenly spaced steps (Fig. 5A and B). For larger N , the gene-copy number $g(t)$ increases more gradually, and hence the discrete jumps in the gene density $\bar{G}(t)$ are considerably smaller. The effect on the clock is dramatic: In both the NTFO (solid line) and the TTC-PPC (dashed line), not only do the locked regions almost disappear for $N = 4$ (Fig. 5C), but the variance in the peak-to-peak time T_{PP} becomes very small (Fig. 5D). This latter effect persists even when significant stochastic variability in the rhythm of gene replication (parameterized by the SD σ_{rep} in the replication times; Supporting Information) is introduced. In fact, whereas *S. elongatus* can have as many as $N \approx 4$ chromosome copies at the beginning of the cell cycle (35, 40–42), these changes are already apparent when N is increased from 1 to 2 (Fig. S3).

Discussion

Given the pleiotropic roles of both the cell cycle and the circadian clock, it is natural to ask whether they also influence each other. Our central observation is that such influence need not

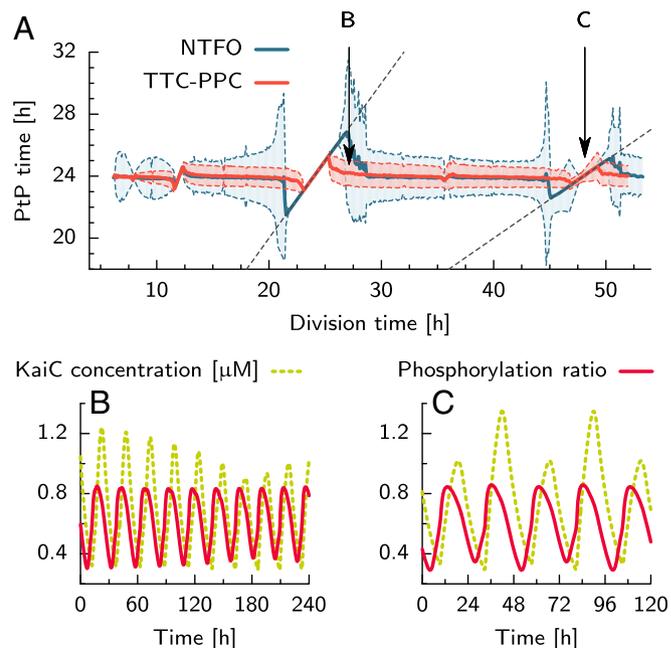


Fig. 4. A clock with interlocked phosphorylation and transcriptional cycles is more robust against perturbations from periodic gene replication. (A) The average peak-to-peak times ($\langle T_{\text{PP}} \rangle$) of the phosphorylation level $p(t)$ of the coupled TTC-PPC model of the Kai system (36) (red solid curve) and of $C(t)$ of the NTFO (solid blue curve, same as Fig. 2A), as a function of the cell division time T_d . The shaded regions show the SD of T_{PP} . Both the widths of the locking regions and the SDs of the peak-to-peak time outside the locking regions are smaller for $p(t)$ of the Kai system than for $C(t)$ of the NTFO. Arrows indicate division times for which we show time traces in B and C. (B) The total KaiC concentration $C_{\text{tot}}(t)$ (dashed line) and $p(t)$ (solid line) at $T_d = 26$ h. Although the amplitude of $C_{\text{tot}}(t)$ is strongly affected by gene replication, the amplitude of $p(t)$ is nearly constant. (C) Plots of $p(t)$ and $C_{\text{tot}}(t)$ at $T_d = 48$ h, where the amplitude of $C_{\text{tot}}(t)$ alternates between a low and a high value depending on the gene copy number in the cell. In contrast, $p(t)$ is almost unaffected by gene replication.

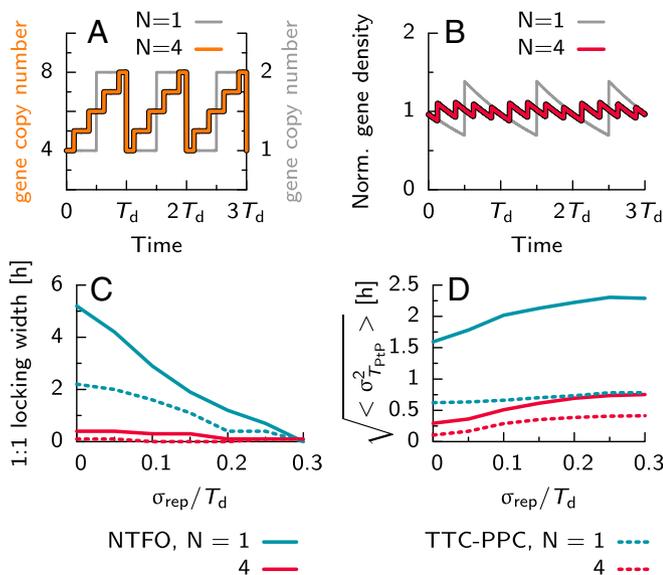


Fig. 5. Multiple chromosome copies strongly reduce the cell cycle's effect on the circadian clock. (A) Gene copy number $g(t)$ for initial gene copy numbers $N=4$ (thick curve, left axis) and $N=1$ (thin curve, right axis) versus time (in units of cell-cycle time T_d). The increase in $g(t)$ is more gradual for $N=4$ than for $N=1$. (B) The gene density $G(t)=g(t)/V(t)$, normalized to its time average, for $N=4$ (thick curve) and $N=1$ (thin curve). At a higher gene copy number, the deviations from the average gene density become smaller. The width of the 1:1 locking region (C) and the square root of the average variance in the peak-to-peak time (D) as a function of the SD in the gene replication time σ_{rep} in a model where the times of replication events vary stochastically about their means (*Supporting Information*), for the NTFO (solid line) and the TTC-PPC (36) (dashed line). Increasing the chromosome copy number N reduces both the width of the locking region (C) and the variance in the peak-to-peak time (D). In contrast, whereas increasing σ_{dup} reduces the former, it increases the latter. See also Figs. S3 and S9.

involve specific interactions between the core genes or proteins of the two systems (2, 10, 11); rather, the simple fact that the number of cellular copies of a given gene necessarily experiences discrete jumps during DNA replication (Fig. 1) implies that clocks must in general feel a periodic driving from the cell cycle (12). Whereas some genetic circuits can simply average over this time-varying input, oscillators—including biological clocks—are known to be especially sensitive to rhythmic forcing. Indeed, an NTFO either locks to the cell cycle or shows erratic oscillations for a range of doubling times T_d (Fig. 2), losing its ability to function as a clock in either case.

In light of this strong and detrimental coupling between the cell cycle and a simple transcriptional clock, it is all the more striking that the *S. elongatus* clock is so stable. Our analysis highlights two features of the cyanobacterial clock that are predicted to allow the necessary decoupling from the cell cycle. First, a time-varying gene dosage influences a clock with an autonomous posttranslational oscillator less than it does a purely transcriptional clock. This observation that a PPC is able to protect a TTC complements our previous finding that in a rapidly growing cell a PPC cannot function without a TTC (36). Together, our results show that a robust clock requires both a TTC and a PPC.

Even within the combined TTC-PPC, the oscillations of the KaiC phosphorylation fraction $p(t)$ are less affected by periodic gene replication than are those of the total KaiC concentration $C_{tot}(t)$ (Fig. 4 and Fig. S2C). Strikingly, the RpaA-based push-pull network that communicates the clock state to the rest of the cell responds to p while ignoring the more strongly fluctuating C_{tot} [somewhat in the spirit of mechanisms that improve the robustness of bacterial chemotaxis to gene expression noise (44)]. This filtering function of the push-pull architecture could help explain why the *S. elongatus* clock

has a relatively complex output mechanism requiring both CikA and SasA rather than a simpler linear design (45).

The second feature of the *S. elongatus* clock that we predict mitigates perturbations from the cell cycle is the presence of multiple, identical, asynchronously replicating chromosome copies (35, 40, 42, 43). This reduces the importance of each individual gene replication event: Rather than seeing a single doubling of the number of gene copies each cell cycle, a cell with many chromosomes instead sees a number of smaller jumps that it can more easily ignore (Fig. 5). This adaptation may thus have evolved in part to protect the *S. elongatus* clock from cell-cycle effects.

Whereas we have argued that the cell cycle generically affects any transcriptional clock, no comparably general mechanisms exist in the other direction. Moreover, although in many eukaryotic systems the clock is known to regulate key cell-cycle genes (2–9, 46), no similar, specific connections have yet been characterized in *S. elongatus*. In particular, clock-dependent cell-cycle gating (4), because it acts on cell division but not on growth or DNA replication, does not allow the clock to block the discrete gene replication events that underlie the driving. Nonetheless, because the majority of *S. elongatus* genes show some degree of clock-dependent expression (47), it is possible that the cyanobacterium's clock does regulate its cell cycle in some as-yet-undiscovered way. Any such coupling would, however, have to be weak enough to be consistent with the observation that the rhythm of DNA replication does not depend on clock phase (4, 35, 40, 42, 43). Because phase locking between two oscillators has strong similarities to the locking of a single oscillator to periodic driving (19), most of our qualitative conclusions would remain unchanged in this case.

To isolate the behavior of the core, autonomous circadian oscillator, studies in the laboratory are typically performed at constant light levels. In keeping with this tradition, we have limited ourselves here to models of free-running clocks, without any diurnal environmental variation. In nature, however, the circadian clock is exposed to many additional entrainment signals, most notably the 24-h light-dark cycle. In fact, the environmental and cell-cycle entrainment signals are intricately intertwined, because DNA replication and the synthesis of most proteins, including clock components, come to a standstill in the dark in a clock-independent fashion (43, 48). We leave the effects of this complex interplay for future work.

Although we have focused on interactions between the cell cycle and the clock in *S. elongatus*, the basic idea that periodic gene replications must influence biological oscillators is more general and should apply to a wide range of prokaryotic and eukaryotic species. Indeed, cell-cycle-dependent changes in gene expression have clearly observable effects on gene expression in eukaryotic cells (16), and recent experiments in cultured metazoan cells strongly suggest that the cell cycle exerts a considerable influence on the circadian clock, generally leading to phase-locking of the two oscillators (10, 11). Other generic forms of driving from the cell cycle may also play a role here: For example, in contrast to prokaryotes, eukaryotes typically shut down transcription around mitosis, thereby introducing another source of periodic, cell-cycle-dependent variation in protein synthesis (2, 10, 11). Our analysis thus highlights an important constraint on the design of circadian clocks in organisms from bacteria to humans.

Further, there is no reason for the effects of regular, discrete gene replications to be limited to circadian clocks; they should be observable in any cellular oscillator that depends on transcription and has a period on the same order as that of the cell cycle. Thus, our results may be relevant to phenomena such as coupling between the cell cycle and the segmentation clock in vertebrate development (49). Similarly, in *Supporting Information* (Figs. S6 and S7) we show that two well-known synthetic circuits (50, 51) can also lock to the cell cycle and that the strength of locking depends sensitively on the oscillator architecture.

Because we have argued that *S. elongatus* possesses particular adaptations that decouple its circadian clock from the cell cycle, the most obvious experimental test of our ideas would be to observe the consequences of blocking or removing these features. Several strains already exist that might allow just such experiments. Mutants of *S. elongatus* are known with significantly fewer chromosomes per cell than the wild type (52); moreover, in some other *Synechococcus* strains, cells are always monoploid (41). We find that in cells where the number of chromosomes goes from one to two over the course of a single division cycle, it should be possible to observe clear signatures of driving by the cell cycle in plots of KaiC's abundance—but not its phosphorylation level—as a function of time (Fig. 4). We predict that this effect will be further strengthened if the PPC is

removed entirely. It is well-established that this can be accomplished by hyperphosphorylating KaiC (53, 54). In all cases, one could study forcing by the cell cycle at a variety of different doubling times. We suggest, however, that a doubling time near 48 h offers a particularly unambiguous signature of the cell cycle's influence: The KaiC abundance as a function of time should then rise and fall every 24 h, with successive peaks strictly alternating between higher and lower levels (Fig. 4C).

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