Cell growth, DNA replication, mitosis and division are the fundamental processes by which life is passed on from one generation of eukaryotic cells to the next. The eukaryotic cell cycle is intrinsically a periodic process but not so much a ‘clock’ as a ‘copy machine’, making new daughter cells as warranted. Cells growing under ideal conditions divide with clock-like regularity; however, if they are challenged with DNA-damaging agents or mitotic spindle disrupters, they will not progress to the next stage of the cycle until the damage is repaired. These ‘decisions’ (to exit and re-enter the cell cycle) are essential to maintain the integrity of the genome from generation to generation. A crucial challenge for molecular cell biologists in the 1990s was to unravel the genetic and biochemical mechanisms of cell cycle control in eukaryotes. Central to this effort were biochemical studies of the clock-like regulation of ‘mitosis promoting factor’ during synchronous mitotic cycles of fertilized frog eggs and genetic studies of the switch-like regulation of ‘cyclin-dependent kinases’ in yeast cells. In this review, we uncover some secrets of cell cycle regulation by mathematical modelling of increasingly more complex molecular regulatory networks of cell cycle ‘clocks’ and ‘switches’.

1. Introduction

The cell cycle is the sequence of events whereby a living cell replicates all its components and divides, more or less evenly, into two daughter cells that receive all the material and information necessary to repeat the process. The central role of the cell cycle is to transmit a cell’s genome (its full complement of DNA molecules) to the next generation of cells. In eukaryotic cells, this role is achieved by fully and accurately replicating all chromosomes during S phase of the cell cycle, and subsequently by precisely partitioning the replicated chromosomes to the two daughter cells during M phase (mitosis) and cell division (figure 1, upper half). S and M phases are usually separated by temporal gaps, and the sequence G1–S–G2–M/CD is repeated faithfully in succeeding cell cycles [1].

The replication of cells is an intrinsically cyclic process because cell division creates two daughter cells that are primed to repeat the process. In some circumstances, like the early embryonic divisions of a frog egg or laboratory cells growing in a rich culture medium, cells replicate their DNA and divide periodically, like a clock; whereas in other circumstances, like cells whose DNA has been damaged by ionizing radiation, progression through the cell cycle is blocked by switch-like ‘surveillance and checkpoint’ mechanisms. Thus, control of cell cycle progression shares characteristics of the time-keeping and decision-making processes that are the theme of this special issue [2,3].

Because cell growth and division are foundational to all biological growth, repair, reproduction and development, it is crucial that we sort out the clock-like and switch-like properties of the cell cycle, and that we come to understand the molecular mechanisms that underlie these processes. Success
in this endeavour will have far-reaching consequences for agriculture, medicine and the biotech industry.

2. Cyclin-dependent kinases

In eukaryotic cells, the initiation of cell cycle events and the detection and correction of errors are carried out by a complex network of interacting proteins centred around a class of enzymes called ‘cyclin-dependent kinases’ (CDKs). By phosphorylating and activating (or inactivating) a host of target proteins, CDKs orchestrate the events of the cell cycle, and CDKs themselves are targets of ‘error correction mechanisms’ that block further progression through the division cycle until problems in the copying or partitioning of chromosomes can be resolved [1]. As their name implies, CDKs must bind to a regulatory subunit, a ‘cyclin’ molecule, in order to become able to phosphorylate specific protein targets. The first cyclin–CDK dimer to be characterized biochemically was cyclin B–Cdk1 [4], also known as M-phase promoting factor (MPF). We hereafter indicate dimers with a colon, e.g. CycB:Cdk1.

The biochemistry of MPF was unravelled in the 1970s and 80s by the joint efforts of biochemists, geneticists and molecular biologists. The basic picture that arose from early studies of MPF dynamics in frog oocytes and embryos [5] is illustrated in figure 1 (lower half). Cyclin B is synthesized at a constant rate and rapidly combines with a constant pool of Cdk1 subunits to form CycB:Cdk1 dimers (i.e. active MPF). When MPF activity is high enough, the cell enters mitosis. Among many other mitotic substrates, high activity of MPF phosphorylates and activates the anaphase-promoting complex/cyclosome (APC/C). The APC/C has two decisive functions [1]: to activate separase (promoting sister chromatid separation in anaphase) and to polyubiquitinate cyclin B (promoting degradation of cyclin B by proteasomes). APC/C activation is delayed to give the cell time to condense its chromosomes and align them on the mitotic spindle [6]. Then, APC/C activity is maintained long enough during anaphase and telophase to degrade most of the cell’s cyclin B, even though MPF activity is dropping precipitously as cyclin B is degraded. These curious properties of APC/C activity—the time delay and the persistence—will play crucial roles in our story.

3. Cell cycle oscillations in early embryonic divisions of the frog egg

During divisions 2–12 of a fertilized frog egg, the embryonic cells divide rapidly and synchronously without growth or checkpoint mechanisms. Cyclin B accumulates steadily during interphase and is then rapidly and fully degraded as cells exit mitosis and divide. These oscillations are driven by periodic degradation of cyclin B, in consequence of the negative feedback loop by which CycB:Cdk1 activates APC/C [7], in turn causing the degradation of cyclin B and loss of CycB:Cdk1 activity (figure 1, lower half).

(a) Model no. 1

In 1991, Goldbeter [8] modelled these oscillations with a set of ordinary differential equations (ODEs) for [MPF], [Kin] and [APC]:

\[
\frac{d[\text{MPF}]}{dt} = k_{\text{p, cyc}} - \left( k_{\text{d1, cyc}} + k_{\text{d2, cyc}} [\text{APC}_C] \right) [\text{MPF}],
\]

(3.1a)

\[
\frac{d[\text{Kin}]}{dt} = \frac{k_{\text{ph, gwl}} [\text{MPF}] [\text{Kin}]}{f_{\text{p, kin}} + [\text{Kin}]} - \frac{k_{\text{d1, gwl}} [\text{PP}]}{f_{\text{d, kin}} + [\text{Kin}]} [\text{Kin}]
\]

(3.1b)

and

\[
\frac{d[\text{APC}_C]}{dt} = \frac{k_{\text{p, apc}} [\text{Kin}]}{f_{\text{p, apc}} + [\text{APC}_C]} - \frac{k_{\text{d, apc}} [\text{PP}]}{f_{\text{d, apc}} + [\text{APC}_C]}.
\]

(3.1c)

In these equations, ‘MPF’ refers to the CycB:Cdk1 dimer (a protein kinase), ‘Kin’ refers to the active (phosphorylated) form of an unspecified ‘intermediary’ protein kinase, ‘APC’

\[
\frac{d[\text{MPF}]}{dt} = k_{\text{p, cyc}} - \left( k_{\text{d1, cyc}} + k_{\text{d2, cyc}} [\text{APC}_C] \right) [\text{MPF}],
\]

(3.1a)

\[
\frac{d[\text{Kin}]}{dt} = \frac{k_{\text{ph, gwl}} [\text{MPF}] [\text{Kin}]}{f_{\text{p, kin}} + [\text{Kin}]} - \frac{k_{\text{d1, gwl}} [\text{PP}]}{f_{\text{d, kin}} + [\text{Kin}]} [\text{Kin}]
\]

(3.1b)

and

\[
\frac{d[\text{APC}_C]}{dt} = \frac{k_{\text{p, apc}} [\text{Kin}]}{f_{\text{p, apc}} + [\text{APC}_C]} - \frac{k_{\text{d, apc}} [\text{PP}]}{f_{\text{d, apc}} + [\text{APC}_C]}.
\]

(3.1c)
refers to the active form of APC/C, and ‘PP’ denotes a protein phosphatase that opposes the kinase activities. (The intermediary kinase is introduced to provide a time delay in the negative feedback loop between CycB and APC, which is a requirement for limit cycle oscillations; see e.g. [9].) Furthermore, $[\text{Kin}] = [\text{Kin}_\text{tot}] - [\text{Kin}_\text{P}]$ and $[\text{APC}] = [\text{APC}_\text{tot}] - [\text{APC}_\text{P}]$, where $[\text{Kin}_\text{tot}]$ and $[\text{APC}_\text{tot}]$ are the ‘total’ concentrations, assumed constant. $[\text{PP}]$ is also assumed to be a constant concentration. The other parameters: $k_{\text{sy}}$ and $k_{\text{de}}$ are rate constants for synthesis and degradation (of cyclin B, the limiting component of MPF), $k_{\text{ph}}$ and $k_{\text{dp}}$ are rate constants for substrate phosphorylation and dephosphorylation, and $J_{\text{ph}}$ and $J_{\text{dp}}$ are Michaelis constants for the kinases and phosphatases. (The reason for the unexpected ‘gwI’ and ‘dpI’ notation in equation (3.1b) will become apparent soon.)

Figure 2 plots a representative oscillation for ODEs (3.1a–c), using the parameter values in table 1. (Computer codes for all the models can be found in the supplementary material.) These oscillations (period approx. 46 min) compare favourably with MPF oscillations in the early frog embryo (period approx. 30 min). In figure 2b, we project the limit cycle oscillation onto the plane spanned by $[\text{MPF}]$ and $[\text{APC}_\text{P}]$. The red and green curves are ‘nullclines’, calculated by solving equation (3.1b) for the pseudo-steady state value of $[\text{Kin}]$ as a function of $[\text{Kin}]$ and $[\text{MPF}]$, substituting this function into equation (3.1c), and then treating equation (3.1a) and (3.1c) as a pair of nonlinear ODEs for $[\text{CycB}]$ and $[\text{APC}_\text{P}]$. The green curve is a true nullcline for MPF because the vector field is vertical along this curve. The red curve is a pseudo-nullcline for APCP—the orbit (the grey curve) does not cross the ‘nullcline’ curve horizontally—because KinP induces a time delay between CycB and changes in APCP.

At the time, this model was appropriate because experimental observations clearly showed a delay between activation of CycB:Cdk1 kinase and CyclB degradation (induced by APC/C ubiquitination of CyclB) [6]. Goldbeter’s assumption that the activations of Kin and APC are ‘ultrasensitive’ response functions was confirmed, in part, by Yang & Ferrell [10], who showed that APC activity as a function of $[\text{CycB}\cdot\text{Cdk1}]$ is a very steep, sigmoidal function (effective Hill exponent = 32). Nonetheless, the interpretation of these oscillations was unclear because the molecular mechanism of the delay (i.e. the ‘intermediary’ enzyme) was unknown.

(b) Model no. 2

More recently the molecular basis of this delay has become clearer, thanks to a study by Mochida et al. [11] and Gharbi-Ayashi et al. [12] of the protein phosphatase 2A (PP2A) and its regulatory subunit, B35. These authors found that PP2A: B35 is indirectly inhibited by CyclB:Cdk1 during mitosis, by the mechanism illustrated in the inset to figure 3b.

Table 1. Parameter values for all simulations. For all models, $[\text{PP}] = [\text{GwItot}] = [\text{APC}_\text{tot}] = [\text{Cdc20}_\text{tot}] = [\text{B55}_\text{tot}] = 1$, $[\text{ENSAtot}] = 4$; unless otherwise stated, $[\text{Cdc20}_\text{tot}] = [\text{Wee1}_\text{tot}] = [\text{Cdc25}_\text{tot}] = 1$.

| parameter        | Model no. 1 | Model no. 2 | Model no. 3 | Model no. 4 |
|------------------|-------------|-------------|-------------|-------------|
| $k_{\text{sy}}$ | 0.04        | 0.04        | 0.04        | 0.04        |
| $k_{\text{de},1}$ | 0.02        | 0.02        | 0.02        | 0.02        |
| $k_{\text{de},2}$ | 0.4         | 2           | 0.5         | 1           |
| $k_{\text{ph},\text{gwI}}$ | 0.2         | 0.1         | 2           | 2           |
| $k_{\text{dp},\text{gwI}}$ | 0.08        | 0.2         | 2           | 0.5         |
| $k_{\text{ph},\text{APC}}$ | 0.2         | 1           | 1           | 1           |
| $k_{\text{dp},\text{APC}}$ | 0.08        | 20          | 20          | 20          |
| $k_{\text{ph},\text{ensa}}$ | 0.2         | 1           | 1           | 1           |
| $k_{\text{cat}}$ | 0.1         | 1           | 1           | 1           |
| $k_{\text{as},1}$ | 10          | 10          | 10          | 10          |
| $k_{\text{di},1}$ | 0.1         | 0.1         | 0.1         | 0.1         |
| $k_{\text{dp},\text{gwI}}$ | 20          | 20          | 20          | 20          |
| $k_{\text{dp},\text{APC}}$ | 0.02        |              |              | 0.02        |
| $k_{\text{dp},\text{cdk1}}$ | 2           |              |              | 2           |
| $k_{\text{dp},\text{cdk2}}$ |              | 0.2         |              | 2           |
| $k_{\text{dp},\text{cdk2}}$ |              |              |              | 2           |
Cyclin B : Cdk1 phosphorylates and activates a protein kinase called ‘Greatwall’ (Gwl) [13], which in turn phosphorylates and activates ENSA, an inhibitory substrate of PP2A : B55. To connect this pathway to APC/C dynamics, Zhang et al. [14] proposed that PP2A : B55 is at least partly responsible for dephosphorylation/inactivation APC/C, as in figure 3b (inset). This interaction creates a coherent feed-forward loop: MPF → APC/C, and MPF → Gwl → ENSA → B55 → APC/C. A physiological advantage of this coherent feed-forward loop is that high kinase activity tends to depress phosphatase activity, and vice versa; thereby limiting ‘futile cycling’ of ATP. We model this network by the following ODEs, adapted from Zhang et al. [14]:

\[
\frac{d[MPF]}{dt} = k_{cyt,MPF} - (k_{cty,MPF} + f k_{de,MPF})[MPF],
\]

\[
\frac{d[Gwl]}{dt} = k_{p,gwl}[MPF][Gwl] - k_{dp,gwl}[PP][Gwl],
\]

\[
\frac{d[ENSA]}{dt} = k_{ph,ensa}[Gwl][ENSA] - k_{cat}[ENSA]B55,
\]

\[
\frac{d[APC]}{dt} = k_{ph,APC}[MPF][APC] - k_{dp,APC}B55[APC],
\]

\[
\frac{d[APC_{20}]}{dt} = k_{as1}([APC_{20}] - [APC_{20}](C20_{tot}) - [APC_{20}]) - k_{dt1}[APC_{20}],
\]

\[
\text{and } [ENSA]B55 = \frac{2[ENSA]}{B + \sqrt{B^2 - 4[ENSA][B55]}}.
\]

where \( B = [ENSA_{20} + B55_{tot}] + K_m, K_m = (k_{d12} + k_{cat})/k_{as2}, \)

\[
[ENSA_{tot}] = [ENSA] + [ENSA,free] + [ENSA_{20}]B55 = [ENSA] + [ENSA_{20}]
\]

and \( f = \frac{[CycB_{ub}]}{[MPF]} = \left( \frac{[APC_{20}]}{[deUB]} \right)^4 \left( 1 - \frac{[APC_{20}]}{[deUB]} \right) \times \left( 1 - \frac{[APC_{20}]}{[deUB]} \right)^3. \)

The derivation of these equations requires some explanation. (3.2a) \([MPF] = [CycB : Cdk1], \) where Cdk1 is in excess, and Cyclin B is synthesized at constant rate and degraded slowly \( (k_{de}) \) by a constitutive protease, or rapidly \( (k_{de2}) \) after Cyclin B has been multiply ubiquitinated by APCP : Cdc20; \( f = \) fraction of Cyclin B pool that is polyubiquitinated, according to an ordered-distributive mechanism [15] with \( [deUB] = \) constant activity of a deubiquitinating enzyme. (To be definite, we assume that Cyclin B must be ubiquitinated four times before it is degraded by proteasomes.) (3.2b) Gwl is phosphorylated by MPF and dephosphorylated by a constitutive phosphatase, PP. (3.2c) ENSA is phosphorylated by Gwl and dephosphorylated by PP2A : B55, abbreviated as ‘B55’ [16]; [ENSA_{B55}] is the concentration of the enzyme–substrate complex, and \( k_{as2}, k_{d12} \) and \( k_{cat} \) are the rate constants for association, dissociation and catalysis of the enzyme–substrate complex. (3.2d) APC is phosphorylated by MPF and dephosphorylated by B55. (3.2e) APCP binds reversibly with Cdc20 to form the active ubiquitin ligase, APCP : Cdc20; the association and dissociation rate constants are \( k_{as1} \) and \( k_{dt1}. \) (3.2f) The enzyme–substrate complex \( [ENSA]B55 \) is calculated by the ‘total quasi-steady state approximation’ [17]. Notice that \( [ENSA]_{B55} = [ENSA]_{B55,free} + [ENSA]_{B55}. \)

In figure 3, we plot oscillations of \([MPF], [B55] \) and \([APC_{20}] \) predicted by this model as functions of time \((a)\) and as a limit cycle projected on the plane spanned by \([MPF] \) and \([APC_{20}] \) \((b)\). The oscillations are ‘soft’
(nearly sinusoidal), and the phosphatase (B55) is only about 90° out-of-phase with the kinase (MPF), so ‘futile cycling’ is reduced but not as much as would be possible with phase shift of a 180°.

In figure 3b, we also plot pseudo-nullclines for MPF (green) and APC/C20 (red). The pseudo-nullclines are calculated using the capacity of XPPAUT to plot one-parameter bifurcation diagrams for a reduced set of ODEs [18]; XPPAUT is freely available from http://www.math.pitt.edu/~bard/xpp/xpp.html. For example, to calculate the pseudo-nullcline for MPF, we remove equation (3.2) from the ODEs, treating [APCPC20] as a parameter, and plot the one-parameter bifurcation diagram for the remaining equations, with [MPF] as the variable and [APC/C20] as the parameter. Similarly, for the APC/C20 nullcline, we remove equation (3.2a) from the ODEs, treating [MPF] as a parameter, and plot the one-parameter bifurcation diagram for the remaining equations, with [APC/C20] as the variable and [APC/C20] as the parameter. Because our dynamical system is five-dimensional, the projected orbit (the dotted line in figure 3b) does not cross the pseudo-nullclines horizontally and vertically, as it would for true nullclines of a two-dimensional dynamical system; but, nonetheless, the pseudo-nullclines provide a useful projection of the vector field of the full dynamical system, and we shall use pseudo-nullclines, calculated in this way, to describe more complex mechanisms to come.

(c) Model no. 3
Another level of control was proposed by Vinod & Novak [19] and experimentally confirmed by Mochida et al. [20] that PP2A : B55 dephosphorylates Gwl (see inset to figure 4b). They modelled the revised diagram by the dynamical system (3.2) with equation (3.2b) replaced by

\[
\frac{d[Gwl]}{dt} = k_{ph,gwl}[MPF] \cdot [Gwl] - (k_{dp1,gwl}[PP] + k_{dp2,gwl}[B55]) \cdot [Gwl].
\]

As before, we plot the time courses and pseudo-phase plane in figure 4a,b. This seemingly slight modification to the model causes a dramatic qualitative change to the phase plane. The APC/C pseudo-nullcline is now S-shaped, i.e. APC/C activity is now a bistable function of MPF because PP2A : B55 activity is now controlled by a bistable switch. Bistability of B55 derives from the positive feedback loop: Gwl \rightarrow ENSA \rightarrow B55 → Gwl, which is modulated by MPF. Bistability of B55 drives bistability of APC/C. That APC/C activity is a bistable function of MPF was already a reasonable hypothesis, given the very abrupt activation of APC/C by increasing activity of MPF ($n_{d1} = 32$, observed by [10]), and, indeed, it has been confirmed recently by Kamenz et al. [21].

As is evident in figure 4, the oscillations of Model no. 3 are now ‘hard’ (i.e. abrupt jumps between B55 active, APC/C inactive and vice versa). Now MPF activity looks more like the observed mitotic cycles of early embryos, with a steady rise of [MPF] and an abrupt fall. But futile cycling is still a problem because MPF and B55 are both active during much of interphase.

4. Cell cycle oscillations in frog egg extracts
In 1989, Murray & Kirschner [22] described how to prepare frog egg extracts that exhibit sustained oscillations of MPF activity in vitro. Unlike in vivo, the in vitro oscillations are marked by significant inhibitory Cdk1-phosphorylation in interphase. As worked out by Nurse & Hayles [23] in fission yeast, Cdk1 is inactivated by phosphorylation on a tyrosine residue by Wee1 kinase (CycB : Cdk1 → CycB : Cdk1P) and reactivated by dephosphorylation by Cdc25 phosphatase. Furthermore, Wee1 is inactivated by phosphorylation by MPF, and Cdc25 is activated by phosphorylation by MPF [5]. It is known that Wee1 and Cdc25 are phosphorylated on multiple sites by MPF, and that the activity of each is a sigmoid function of MPF activity [24,25]. This reaction network is illustrated in figure 5a.

(a) Model no. 4
Introducing these reactions in Model no. 3, we obtain

\[
\frac{d[CycB]}{dt} = k_{sy,cycb} - (k_{de1,cycb} + f k_{de2,cycb}) \cdot [CycB],
\]

\[
\frac{d[MPF]}{dt} = k_{sy,cycb} - (k_{de1,cycb} + f k_{de2,cycb}) \cdot [MPF] - (k_{ph1,cycb}[Wee1] + k_{ph2,cycb}[Wee1]) \cdot [MPF] + (k_{dp1,cycb}[Cdc25] + k_{dp2,cycb}[Cdc25]) \times ([CycB] - [MPF]).
\]
d[Gwl]/dt is given by equation (3.3b), d[ENSA]/dt, d[APC]/dt and d[APC/C]/dt are given by equations (3.2–5), [ENSA]B55 by (3.2f), and B through f by (3.2g). Also
\[ \frac{[\text{Wee1}]}{[\text{Wee1}_{\text{tot}}]} = \left(1 - \left(\frac{[\text{MPF}]}{[\text{CAP}]^5}\right)^3\left(1 - \left(\frac{[\text{MPF}]}{[\text{CAP}]^4}\right)^3\right)^{-1}\right) \]
and
\[ \frac{[\text{Cdc25}_{\text{p}}]}{[\text{Cdc25}_{\text{tot}}]} = \left(1 - \left(\frac{[\text{MPF}]}{[\text{CAP}]^5}\right)^2\right) \times \left(1 - \left(\frac{[\text{MPF}]}{[\text{CAP}]^4}\right)^3\right)^{-1}, \]
where
\[ [\text{Wee1}_{\text{p}}] = [\text{Wee1}_{\text{tot}}] - [\text{Wee1}] \]
and
\[ [\text{Cdc25}_{\text{p}}] = [\text{Cdc25}_{\text{tot}}] - [\text{Cdc25}_{\text{p}}]. \]

These ODEs require some explanation. (4.1a) [CycB_{T}] = [CycB : Cdk1] + [CycB : Cdk1] = 'total cyclin B'. (4.1b) [MPF] = [CycB : Cdk1] = 'active MPF'. (4.1c,d) [Wee1] = concentration of the 'more active' (i.e. unphosphorylated) form of Wee1, and [Cdc25_{p}] = concentration of the 'more active' (i.e. phosphorylated) form of Cdc25. In this model, Wee1 and Cdc25 are phosphorylated on eight sites by MPF by an ordered-distributive mechanism [15], with counter-acting phosphatase 'CAP', assuming that Wee1_{PS,8} are less active and Cdc25_{PS,8} are more active.

Figure 5. APC and MPF are both regulated by bistable switches. (a) The reaction network. MPF + preMPF = CycB_{T}. (b) Time courses of limit cycle oscillation. As before, APC/C is the variable [APC/C\_20]. MPF, B55, CycB, and APC/C are plotted with respect to the left axis and ENSA with respect to the right axis. Parameter values: table 1; \( k_{\text{m}} = 0.0026, \) (d[Ub]) = 0.5, [CAP] = 0.3. (c) Pseudo-phase plane, [APC/C\_20] versus [MPF]. Dashed line shows projection of limit cycle oscillation in (b). Notice that MPF activity is now a bistable function of APC/C. (d) Pseudo-phase plane, [CycB_{T}] versus [MPF]. Dashed line shows projection of limit cycle oscillation in (b). Grey region, [MPF] > [CycB_{T}], is 'unreachable'.

The time courses of selected components of this model are plotted in figure 5b, along with two pseudo-phase plane portraits in figure 5c,d. The time courses of CycB_{T} and MPF agree nicely with the measurements of Pomerening et al. [26] on frog egg extracts, if 1 time unit is approximately equal to 1 min. Comparing the phase plane portraits in figures 4b and 5c, we see that APC/C activity is still a bistable function of [MPF] (red curves in figures 4b and 5c), but now MPF activity is a bistable function of [APC/C\_20] (green curve in figure 5c). The bistability of MPF activity is better visualized in the MPF-CycB_{T} phase plane (green curve in figure 5d). As [CycB_{T}] increases, MPF activity is low at first, but jumps abruptly to high activity (MPF) approximately equal to [CycB_{T}] for [CycB_{T}] greater than 1.2. Then, as [CycB_{T}] decreases (as cyclin B is degraded by active APC/C), MPF activity stays high until [CycB_{T}] drops below 0.5. (This bistability of MPF activity for intermediate levels of [CycB_{T}] was demonstrated experimentally in frog egg extracts by Sha et al. [27] and Pomerening et al. [28].) Notice, in figure 5d, that [CycB_{T}] continues to decrease even after MPF is inactivated by tyrosine-phosphorylation, because there is a time delay between the inactivation of MPF and the subsequent inactivation of APC/C by PP2A:B55.

Dual bistability in Model no. 4 has the added advantage that MPF and B55 activities are now strictly out-of-phase. Because the kinase and phosphatase are not active at the same time, mitotic proteins are highly phosphorylated in...
mitosis and dephosphorylated in interphase, with minimal futile cycling.

Another potential modification worth mentioning is the likely possibility that PP2A:B55 is one of the phosphatases that activates Wee1 and inactivates Cdc25p [29]. This interaction creates two ‘interlinked’ bistable switches [20,30] that are coupled by mutual inhibition (MPF → G1 → B55 and B55 → Wee1 → MPF). As Rata et al. [30] have shown, this network can exhibit three coexisting stable steady states: (1) interphase, with low MPF activity and high B55 activity, (2) metaphase, with high MPF and low B55, and (3) prophase, with intermediate activities of MPF and B55. We will not comment further on this behaviour, because it has yet to be carefully studied theoretically or convincingly demonstrated experimentally [30].

5. Checkpoints

Instead, using Model no. 4, we turn our attention to the three checkpoints that monitor genome integrity during the cell division cycle: the G1 checkpoint, the G2 checkpoint and the spindle assembly checkpoint (SAC). (In figure 1, they are denoted Q1, Q2 and Q3, respectively.) We describe these checkpoints in terms of pseudo-phase plane portraits. For Model no. 4, as illustrated in figure 5d, the (pseudo) nullclines are N-shaped (green) and Z-shaped (orange), and they intersect on the intermediate (unstable) branches of both nullclines; hence, the dynamical system for this particular choice of kinetic parameter values executes sustained limit cycle oscillations (the dotted curve). Clearly, however, as parameter values change, the nullclines will move relative to each other, and new (stable) steady states may be created. Three such configurations are relevant to cell cycle checkpoints: (1) a stable steady state at low [CycB] and low [MPF]—that would be a cell arrested in G1; (2) a stable steady state at high [CycB] and low [MPF]—a cell primed to enter mitosis, but not yet committed to do so; and (3) a stable steady state of high [CycB] and high [MPF]—a cell arrested in metaphase, with high MPF activity (until all chromosomes are properly aligned on the mitotic spindle).

To model these checkpoints, we extend Model no. 4 to include surveillance signals from DNA damage, unrelicated DNA and unaligned chromosomes, as in figure 6a.

(a) Model no. 4—G2

To illustrate a G2 checkpoint (figure 6h), we assume that unreplicated DNA induces sequestration of approximately 40% of Cdc25 in the cytoplasm (we decrease [Cdc25tot] to 0.4). This parameter change creates a pair of steady states—a node and a saddle point (filled circle and open circle)—on the upper branch of the CycB nullcline, thereby blocking progression into M phase. As DNA replication is completed, [Cdc25tot] increases back to 1, and the limit cycle in figure 5d is reestablished by a SNIC bifurcation (saddle-node on an invariant circle).

(b) Model no. 4—spindle assembly checkpoint

Unaligned chromosomes induce the SAC by generating ‘mitotic checkpoint complexes’ (MCCs) that sequester Cdc20, preventing it from binding to APCP. To model this mechanism, we decrease the total amount of Cdc20 available for binding to APCP (we decrease [Cdc20tot] from 1 to 0.2). This parameter change creates a stable state (filled circle) of ‘mitotic arrest’ on the right branch of the MPF nullcline (high MPF activity, figure 6c). When all chromosomes are properly aligned on the mitotic spindle, MCC is rapidly disassembled, the full complement of Cdc20 becomes available to APCP and the limit cycle in figure 5d is recreated (again by a SNIC bifurcation).

(c) Model no. 4—G1

During G1 phase, when Cdc20 is absent, APC/C binds to Cdh1 (a protein homologous to Cdc20) and induces polyubiquitinylation of cyclins, until the start of DNA replication [31]. Unlike Cdc20, Cdh1 binds to unphosphorylated APC/C. To model the role of Cdh1, we rewrite equation (4.1a) as

\[
\frac{d[CycB]}{dt} = k_{kycb} - (k_{k1} + k_{k2} + k_{de3,cycb}) [MPC] + k_{de3,cycb} ([APC_{Kd}] - [APC_p]) [CycB].
\]

In figure 6d, we set \(k_{de3,cycb} = 0.2\). The activity of Cdh1: APC/C keeps CycBT very low (at filled circle), so the cell is arrested in G1 phase. To lift the checkpoint, Cdh1 needs to be inhibited by phosphorylation by G1-active CDKs, which only happens in the absence of DNA damage [31].

6. Size control of cell division in fission yeast

So far, we have focused our attention on limit cycle oscillations of MPF in early embryonic divisions of a fertilized frog egg and in frog egg extracts, because these preparations illustrate the basic principles of mitotic control by CDKs and their opposing phosphatases. This approach highlights the time-keeping aspects of cell cycle regulation in embryos, where periodic alternations between interphase and mitosis are governed by limit cycle oscillations. Then, we touched briefly on mechanisms of checkpoint regulation—only enough to show that the decision-making functions of checkpoints are implemented by bifurcations (figure 6) that introduce a stable steady state into the orbit of the limit cycle. In technical terms, these are saddle-node-on-invariant circle, or SNIC, bifurcations. In this section, we illustrate how the G2-SNIC bifurcation plays a major role in understanding ‘size-control’ of the cell division cycle in fission yeast (Schizosaccharomyces pombe). Similar considerations apply to budding yeast, green algae and animal cells, for which we refer readers to literature sources [32–35].

Progression through the cell division cycle of fission yeast is strongly coupled to cell growth, as has been demonstrated in many experiments over the years [36]. Similarly convincing experimental evidence demonstrates the role of size control in other simple eukaryotic organisms [37], like budding yeast [38,39] and slime moulds [40–42], and there is some evidence for size control of the division of mammalian cells in culture [43], although less conclusive. In wild-type fission yeast cells, cell size governs progression through the cell cycle at the G2 checkpoint [36], and it seems to work by a cell-size-dependent increase in the concentration of Cdc25 during G2 phase [44]. We introduce this effect into Model no. 4 by making \([Cdc25_{tot}]\) a function of cell size, \(V(t)\), which (we assume) increases exponentially from birth to division and is reduced by a factor of 2 at cell division; i.e. we append to Model no. 4

\[
\begin{aligned}
[Cdc25_{tot}] &= V(t), \quad \frac{dV}{dt} = \mu V, \\
V(t) &\rightarrow V(t)/2 \quad \text{at cell division.}
\end{aligned}
\]

\[
\begin{aligned}
\frac{d[CycB]}{dt} &= k_{kycb} - (k_{k1} + k_{k2} + k_{de3,cycb}) [MPC] + k_{de3,cycb} ([APC_{Kd}] - [APC_p]) [CycB].
\end{aligned}
\]
The cell divides if it first enters mitosis (i.e. [MPF] increases above a predefined threshold) and then exits mitosis ([MPF] decreases below a different threshold).

Implementing this model, we show in figure 7a the time course of oscillations. Cell size, \( V(t) \), increases exponentially and drops twofold at cell division. Notice that the phosphatase, PP2A : B55, is active during most of interphase (short G1 + S phase + long G2, as in wild-type fission yeast cells). Total cyclin B accumulates steadily in interphase, but MPF activity is very low, because Cdk1 is phosphorylated by Wee1. At the end of G2 phase, MPF is rapidly activated by Cdc25 phosphatase activity, and the cell enters mitosis. Meanwhile, B55 is inactivated by the MPF–Gwl–ENSA pathway, and, consequently, APC is phosphorylated/activated by MPF. APC binds with Cdc20 and drives degradation of CycB, and falling activity of MPF triggers cell division. Newborn daughter cells repeat the process. Notice that the cell cycle time (G1 + S + G2 + M) is exactly equal to the mass doubling time.

In figure 7b, we portray the 'logic' of these growth-controlled cell division cycles using the concept of a one-parameter bifurcation diagram from the theory of dynamical systems. This diagram depicts the characteristic states of a dynamical system in dependence on the value of a parameter in the differential equations. In this case, the 'state' of the system is represented by the value of the dynamical variable [MPF], and the 'parameter' is cell size \( V \). We can treat cell size as a parameter because the rate of change of \( V \), namely \( \mu V \) (with \( \mu = 0.005 \)) is very slow compared with the rates of change of the dynamical variables [CycB\(_T\)], [MPF], [APCP], etc. For this reason, we may set \( V \) constant and solve the remaining ODEs for the behaviour of the underlying molecular control system at that particular size. In the one-parameter bifurcation diagram, we see that, at small size, the only stable solution of the ODEs is a steady state (red line) of low MPF. As the cell slowly grows, the dynamical system will cling to this stable steady state at first. Let us pick up this 'cell cycle trajectory' (the green dotted curve in figure 7b) at \( V \approx 0.5 \). The cell continues to grow, at low MPF, until the trajectory reaches the SNIC bifurcation at \( V \approx 0.85 \). At this bifurcation point, the stable steady state of low MPF (a 'node') coalesces with the unstable steady state (on the intermediate locus—the grey dashed curve—of 'saddle points'), giving rise to a stable limit cycle (an 'invariant circle') whose maximum and minimum excursions of MPF activity are...
plotted by the green filled circles. Upon passing the SNIC bifurcation point, the growing cell should ‘hop’ onto the limit cycle oscillation, but the speed of the transition is very slow at the bifurcation point. Hence, the cell continues to grow (slowly) until it passes some distance from the SNIC point ($V \approx 1$) before the cell cycle trajectory is captured by the limit cycle. As MPF activity increases abruptly, the cell is driven into mitosis, and as MPF activity drops rapidly, as active APC/C degrades CycB, the cell exits mitosis and divides. As the cell divides, one can see the cell cycle trajectory drop abruptly from $V \approx 1$ to $V \approx 0.5$. At this size, the only long-term behaviour of the dynamical system is the stable steady state of low MPF. The newborn cell enters G1 phase, which (in fission yeast) is very short. Soon thereafter, the cell has enough CDK activity to enter S phase; even the residual kinase activity of tyrosine-phosphorylated MPF is enough to initiate DNA replication [45]. The cell will not enter mitosis until MPF is fully activated, as just described.

Notice that this description of the cell cycle trajectory is independent of the specific growth rate $\mu$ of the cells (within a broad range), so, by this mechanism, the interdivision time will always equal the mass doubling time, a characteristic feature of unicellular eukaryotic organisms.

7. Discussion

Living cells exhibit many types of oscillatory behaviours, such as circadian rhythms, Ca$^{2+}$ and cyclic AMP oscillations, pulsatile hormone secretion, periodic somitogenesis and oscillatory expression of transcription factors like p53 and NF-κB [46]. In each of these cases, oscillations are central to the time-keeping function of the process. But the cell cycle is not intrinsically a periodic process. The primary function of the cell cycle is to accurately replicate the cell’s genome and to partition the replicated chromosomes evenly between the two daughter cells. Hence, the cell cycle is monitored by surveillance mechanisms that can block further progression if problems arise, such as DNA damage, incomplete DNA replication or aberrant alignment of chromosomes on the mitotic spindle. So, progression through the cell cycle is, in most circumstances, more like a copy machine (which can be halted by a paper jam or an empty toner cartridge) than like an alarm clock (which continues to tick whether one gets out of bed or not).

 Nonetheless, there are specific circumstances in which cell division cycles proceed with clock-like regularity. For example, in laboratory settings, when cells are cultured in rich growth media and protected from genome hazards, they grow and divide with a roughly constant interdivision time. A more natural example is that of the early mitotic cycles of a fertilized egg, like frog and sea urchin eggs. These division cycles are typically rapid and synchronous (up to the mid-blastula transition), and they often proceed without safeguarding checkpoint mechanisms.

The mitotic cycles of a fertilized egg are rather like the copy machine in the departmental office during exam week, when it is outputting exam copies at top speed; or like the clothes washing machine in a home with a new baby, which is dealing with dirty linen non-stop. Under less stressful conditions, these machines work at a more leisurely pace, dealing with demands as they arise and heeding checkpoint signals with equanimity. We might say that the free-running mitotic cycles of early embryos, as central as they were to unravelling the biochemistry of cell cycle control in eukaryotes and as appealing as they are to describing the dynamical properties of cell cycle progression, are rather ‘special cases’ of cell cycle control. Much more representative are the un hurried replication–division cycles of growing yeast cells and the somatic cells of plants and animals. In these common circumstances in vivo (rather than in laboratory cultures), cell cycle progression is less like a ‘clock’ (a limit cycle) and more like a ‘copy machine,’ i.e. a sequence of copy-and-collate functions governed by external demands (driven by autonomous cell growth and/or responding to specific growth factors) and internal requirements (completion of DNA synthesis, repair of any DNA damage, perfect alignment of sister chromatids on the mitotic spindle).

Figure 7. Size-controlled mitotic cycle in fission yeast. (a) Upper panel: time course of cell size, $V(t)$, which increases exponentially ($\mu = 0.005$ min$^{-1}$, mass doubling time $= 140$ min) and drops by a factor of 2 at cell division (when [MPF] drops below 0.2). Lower panel: time courses of representative variables. All the variables are read off the left axis, except for ENSA, which is read off the right axis. (b) A one-parameter bifurcation diagram, for [MPF] as a function of $V$, assuming $V$ is constant in the nonlinear ODEs. Solid red curve, stable steady states (nodes); intermediate dashed grey curve, unstable saddle points; upper dashed grey curve, unstable nodes; open green circles, unstable limit cycles emanating from a Hopf bifurcation at $V \approx 0.05$; filled green circles, maxima and minima of stable limit cycle oscillations emanating from a SNIC bifurcation at $V \approx 0.85$. 
These physiological constraints make the study of cell cycle control a delightfully complex example of time-keeping and decision-making in living cells.

Data accessibility. Computer programs for simulating the models described in the paper are provided in the electronic supplementary material.

Authors’ contributions. J.J.T.: conceptualization, formal analysis, investigation, writing—original draft, and writing—review and editing; B.N.: conceptualization, formal analysis, investigation, software, validation, visualization, writing—original draft, and writing—review and editing. Both authors gave final approval for publication and agreed to be held accountable for the work performed herein.

Conflict of interest declaration. We declare we have no competing interests.

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