

A synthetic–natural hybrid oscillator in human cells

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Recent studies have shown that many cell-signaling networks contain interactions and feedback loops that give rise to complex dynamics. Synthetic biology has allowed researchers to construct and analyze well-defined signaling circuits exhibiting behavior that can be predicted and quantitatively understood. Combining these approaches—wiring natural network components together with engineered interactions—has the potential to precisely modulate the dynamics of endogenous signaling processes and control the cell decisions they influence. Here, we focus on the p53 signaling pathway as a template for constructing a tunable oscillator comprised of both natural and synthetic components in mammalian cells. We find that a reduced p53 circuit implementing a single feedback loop preserves some features of the full network's dynamics, exhibiting pulses of p53 with tightly controlled timing. However, in contrast to the full natural p53 network, these pulses are damped in individual cells, with amplitude that depends on the input strength. Guided by a computational model of the reduced circuit, we constructed and analyzed circuit variants supplemented with synthetic positive and negative feedback loops and subjected to chemical perturbation. Our work demonstrates that three important features of oscillator dynamics—amplitude, period, and the rate of damping—can be controlled by manipulating stimulus level, interaction strength, and feedback topology. The approaches taken here may be useful for the rational design of synthetic networks with defined dynamics, and for identifying perturbations that control dynamics in natural biological circuits for research or therapeutic purposes.

live-cell imaging | oscillations | systems biology | mathematical modeling

Cell-signaling networks sense and encode dynamic information. Biochemical oscillators ensure the proper timing of events in periodic processes (1, 2), and transient or sustained activation of signaling proteins can affect cell-fate decisions (3). Because these decisions must be precisely organized in time and space, specific features of the dynamics, such as the timing or amplitude of a pulse, must be tightly controlled. Thus, understanding how feedback loops and other interactions in biological networks determine their dynamics (4) and how these dynamics can be perturbed are central challenges of systems biology.

One approach for understanding how biological networks give rise to specific dynamics is to synthetically engineer simple circuits with well-defined dynamic behaviors (for example, ref. 5). This approach has been applied to transcriptional oscillators, an important class of biological networks. Synthetic oscillators have been engineered in bacteria using negative feedback loops (6) or combinations of negative and positive feedback loops (7, 8). Such synthetic networks were also recently demonstrated in mammalian cells (9). However, these synthetic oscillators were constructed using elements completely foreign to the cell. Networks composed of both natural and artificial elements can be useful in characterizing the dynamic features of natural systems in a controlled way and in modulating the dynamics of natural signaling proteins to exert fine control over a cell's response (10). For example, replacing natural regulation with artificial components highlighted recently the importance of noise in the bacterial competence network (11). Here, we address the challenge of constructing a hybrid synthetic–natural oscillator using components of the p53 signaling network.

p53 is a transcription factor activated in response to cellular stresses, such as DNA damage (12). It activates stress response programs such as apoptosis and cell cycle arrest, and it also regulates targets that modulate its own activation or stability, forming multiple positive and negative feedback loops (13). One of the best-characterized feedback loops acts through the E3 ubiquitin ligase Mdm2; p53 induces *mdm2* transcription and Mdm2 protein targets p53 for degradation (14). Cellular stress activates upstream kinases that posttranslationally modify p53 and Mdm2 and disrupt the p53–Mdm2 interaction, stabilizing p53 and modulating its transcriptional activity.

p53 has been shown to undergo complex dynamics in response to γ -irradiation (IR) (15, 16). After IR, individual cells show a series of p53 pulses characterized by tight control over three distinct dynamic features. First, the pulse amplitude does not depend on the IR dose. Second, the pulses are undamped; the mean amplitude of successive pulses remains constant. Finally, although pulse amplitude can be highly variable between individual cells, the timing of pulses is tightly controlled (16). In our previous work, we showed that the simple p53–Mdm2 feedback loop is insufficient in explaining these features of the dynamics, and that the p53 pulses are driven by pulses in the kinases ATM and Chk2, which participate in additional feedbacks with p53 through the Wip1 phosphatase (Fig. 1A) (17, 18).

Here, we report the construction of synthetic variants of the p53 circuit based on transcriptional stimulation of p53 and its negative regulator, Mdm2. This reduced network does not include the kinases ATM/Chk2, providing a more tractable system for analysis and manipulation. We find that the simple core p53–Mdm2 negative feedback loop undergoes tightly controlled oscillations that share a subset of the features of the IR response. However, in contrast to the full network activated by IR, synthetic activation of the p53–Mdm2 loop generates damped oscillations with pulse amplitudes that depend on the input dose. We constructed and analyzed a mathematical model of this circuit to identify perturbations that could alter specific features of p53's oscillatory behavior. We then tested these predictions experimentally and showed that the damping rate of p53 oscillations can be modulated by additional synthetic positive and negative feedback loops on p53 and the oscillation frequency can be tuned by varying the feedback strength of the p53–Mdm2 loop. This study shows that we can “plug in” to existing elements within human cells and accurately control specific features of their dynamics. It also suggests tools for perturbing specific features of dynamics (e.g., amplitude, period, and damping) of additional oscillators in human cells in a controlled way, a crucial step toward understanding the role they play in signaling pathway responses.

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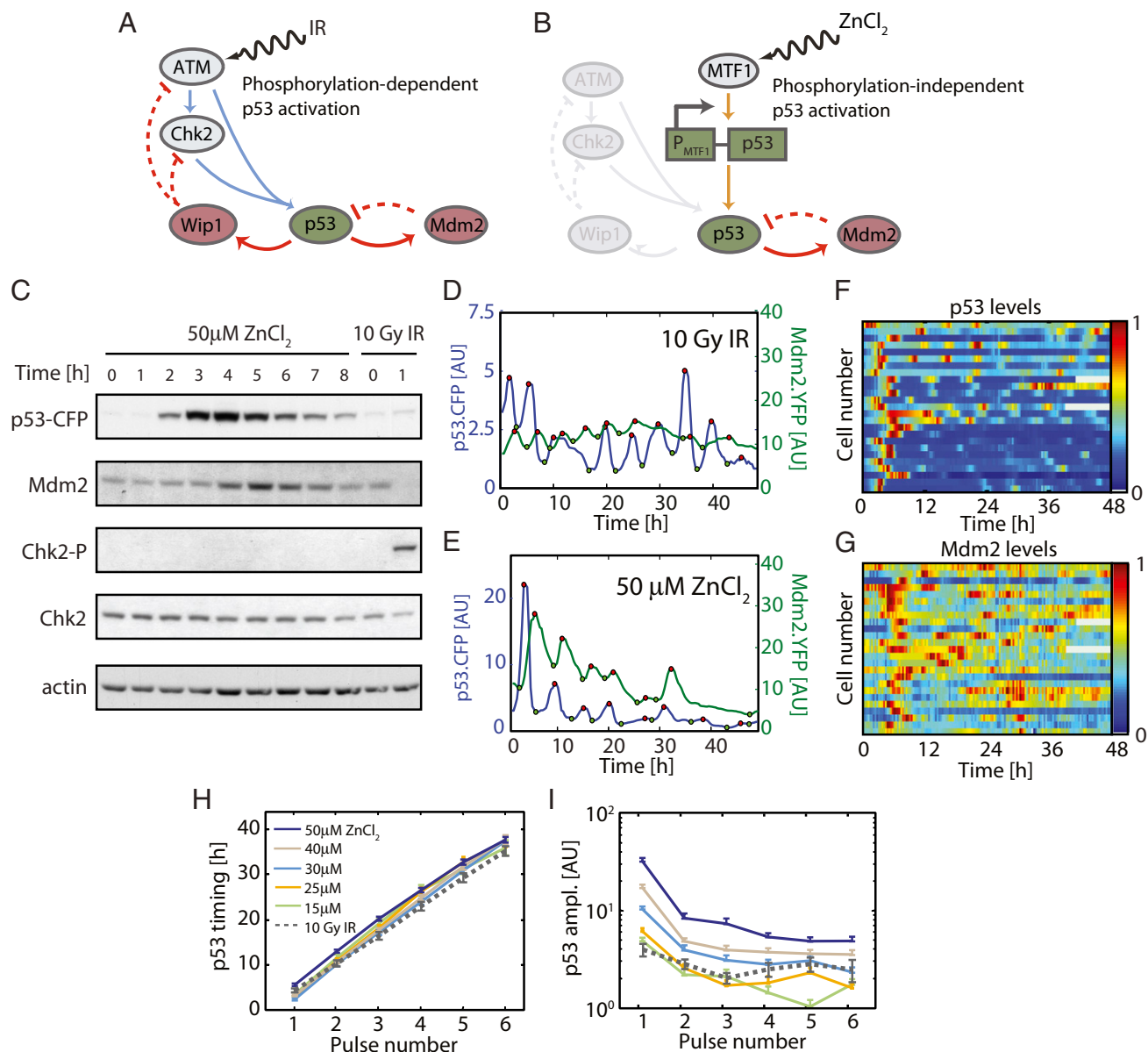
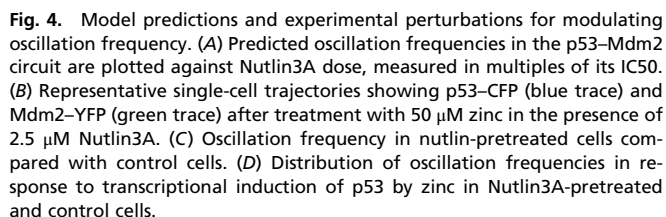


Fig. 1. A reduced p53–Mdm2 circuit generates graded damped oscillations of fixed frequency. (A) Feedbacks regulating p53 dynamics after IR. IR activates ATM and Chk2 phosphorylation, which leads to p53 stabilization. Negative feedbacks act through the Mdm2 ubiquitin ligase to degrade p53, and through the Wip1 phosphatase to inactivate the upstream kinases. (B) A reduced p53 circuit based on transcriptional activation and the p53–Mdm2 feedback loop. Zinc stimulates p53–CFP transcription from a metallothionein (MT) promoter, bypassing IR-induced activation through the ATM/Chk2 kinase cascade and Wip1 negative feedback loop. Induced p53 activates Mdm2 transcription, which negatively regulates p53 stability. (C) Protein levels of p53 and its regulators in response to transcriptional activation of p53. Cells expressing p53–CFP under the MT promoter were treated with 50 μ M zinc or 10 Gy IR, and samples were taken at the indicated time points. Protein levels were analyzed by Western blot, with actin as a loading control. Zinc led to p53 induction followed by Mdm2 induction. Zinc did not affect the level of Chk2 phosphorylation in contrast to activation of the full network by IR. (D and E) Fluorescence intensities of p53–CFP (blue curve) and Mdm2–YFP (green curve) from single cells following IR (D) and transcriptional stimulation by zinc (E). IR (full network) leads to undamped p53 oscillations and zinc induction (p53–Mdm2 core feedback) induces damped oscillations. (F and G) Heat maps of 25 representative cells after 50 μ M zinc treatment. Each row represents a single cell. The p53–CFP (F) and Mdm2–YFP (G) levels were normalized to the maximum amplitude for each cell. (H) p53–CFP pulse timing and (I) fluorescence are shown for each pulse after stimulation with Zinc or IR (mean + SEM computed from at least 50 cells per condition).

Results

Transcriptional Stimulation of the p53–Mdm2 Negative Feedback Generates Damped Oscillations. We first set out to isolate a reduced circuit regulating p53 levels. We used a cell line in which expression of a p53–CFP fusion protein is driven by a zinc-inducible metallothionein promoter (MTp) (15) (Fig. 1B). We found that transcriptional stimulation of the p53–CFP fusion protein by zinc led to a gradual increase in p53–CFP levels in cell populations measured by Western blot, reaching a peak at 4 to 5 h and followed

by a gradual decrease (Fig. 1C and Fig. S1A and B). Induction of p53 by zinc led to an increase in Mdm2 levels (Fig. 1C), demonstrating that synthetic activation of p53 transcription is sufficient to activate the core p53–Mdm2 negative feedback loop even in the absence of cellular stress (19). However, in the absence of IR, feedback loops based on posttranslational modifications [such as the ATM–Chk2–Wip1 loop (17)] were inactive (Fig. 1C). Furthermore, p53–CFP induction using zinc did not induce a cellular stress response, such as cell cycle arrest (Fig. S1C).

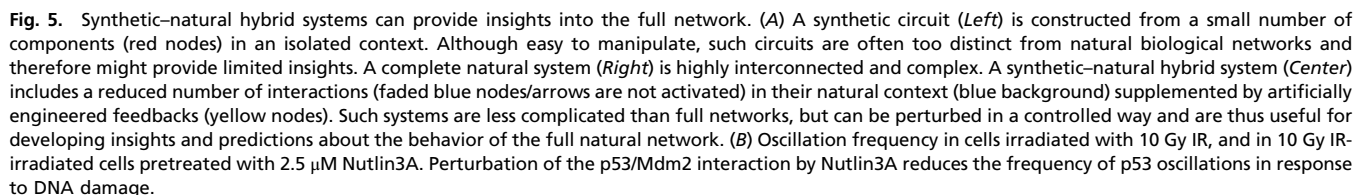


One of the distinguishing features of p53 dynamics is the tight regulation of pulse timing. This precise control arises in both the full network in response to IR (15, 16) (Fig. 1 *D* and *H*), and in the core p53–Mdm2 circuit activated by zinc (Fig. 1 *E* and *H*). We next set out to identify means for controlling the timing of p53 pulses. We used our model to search for interactions in the core p53–Mdm2 circuit that could modulate oscillation frequency by varying each parameter over two orders of magnitude (*SI Appendix, “Parameter perturbation analysis”* and Figs. S5, S6). Although many of the biological processes associated with sensitive parameters are difficult to modulate experimentally, we could alter the affinity of the p53–Mdm2 interaction using the small molecule Nutlin3A

To test this prediction, we preincubated cells with Nutlin3A for 24 h before stimulating them with zinc and followed p53-CFP and Mdm2-YFP levels. We found that cells still oscillate but with longer-duration, lower-frequency pulses (compare Figs. 4B and 1E). We observed an $\approx 20\%$ decrease in the mean oscillation frequency in Nutlin3A pretreated cells (Fig. 4C). We calculated the distribution of pulse frequencies in cells with or without Nutlin3A pretreatment (Fig. 4D), and found a significant difference in frequency between the two cell populations, (P value $< 10^{-6}$ by the Kolmogorov-Smirnoff test). These results show that, as predicted by our model, varying the affinity between p53 and Mdm2 proteins “breaks” the tightly controlled timing of p53 oscillations and decreases their frequency.

Two major thrusts of systems biology are the better understanding of the operation of complex natural networks and the de novo design of simple networks. Studying simple core network motifs in isolation offers the greatest potential for manipulating their behavior, but may not offer insight into the complex natural context (Fig. 5A, *Left*). At the other extreme, natural biological systems can weave many layers of regulation on top of the core signaling pathway, making them hard to understand and to manipulate (Fig. 5A, *Right*). We suggest that taking a “middle road,” stimulating the pathway in its native context using nonnatural inputs and feedback loops, can help to quantitatively understand and perturb the full system (Fig. 5A, *Center*).

To illustrate the connection between hybrid and natural systems, we asked whether our work to modulate pulse frequency in the reduced p53 network could be generalized to the p53 pathway in response to ionizing radiation. One of the striking features of p53 oscillations in response to DNA damage is their tightly regulated frequency across IR dose (15–17). No perturbations to date have been shown to alter this frequency. Our computational and experimental results suggest that the frequency might be altered by perturbing the p53–Mdm2 interaction (Fig. 4 C and D). Indeed, we found that pretreatment of irradiated cells with Nutlin3A changes



the frequency of p53 oscillations in response to DNA damage (Fig. 5B). This finding now presents a unique opportunity for investigating whether information is encoded in the frequency of p53 oscillations, as was shown recently in other oscillating systems (29). In addition, the computational and experimental strategy described here provides a set of tools for perturbing the dynamics of other oscillating networks in human cells to enable future investigation of the function of their dynamics, and perhaps to restore a proper dynamic response in cases where it has been deregulated.

Materials and Methods

Cell Lines and Expression Constructs. We used a clonal MCF7 cell line expressing MTP-p53-CFP and Mdm2p-MDM2-YFP as described (15). To create the NPF and 2NF plasmids, Mdm2p-MTF1-mCherry, and Mdm2p-MTF1-KRAB-mCherry, we used the MultiSite-Gateway recombination system (Invitrogen). The human Mdm2 promoter (15), the MTF1 and MTF1-KRAB cDNA (27), and mCherry (30) were cloned into a modified pDEST43 vector containing the puromycin resistance gene according to the manufacturer's instructions (Invitrogen). After transfection into the MCF7 cell line containing MTP-p53-CFP and Mdm2p-MDM2-YFP (FuGene6, Roche) (15), cells were selected with puromycin and clonal populations were obtained by single-cell dilution.

Cell lines were grown at 37 °C in RPMI medium supplemented with 10% FBS, 100 U/mL penicillin, 100 µg/mL streptomycin, 250 ng/mL amphotericin B, and appropriate selective antibiotics: G418 (0.4 mg/mL), hygromycin (100 µg/mL), or puromycin (0.5 µg/mL).

Time-Lapse Microscopy. Two days before microscopy, cells were plated onto poly-D-lysine-coated glass bottom plates (MatTek Corporation). One day before microscopy, the media was changed to RPMI lacking riboflavin and phenol red supplemented with 2 to 5% FBS and antibiotics to minimize autofluorescence. Cells were viewed with two types of inverted fluorescence microscope systems, named FMS1 and FMS2. Each system is surrounded by an enclosure to maintain constant temperature, CO₂ concentration, and humidity. FMS1 consists of a Nikon Eclipse-TI-E perfect-focus inverted microscope with a cooled CCD camera Hamamatsu Orca-R2. Brightfield, CFP, YFP, and mCherry images were taken every 20 min using a Prior Lumen 200 metal arc lamp. FMS2 consists of a Nikon Eclipse TE2000-E inverted microscope with a cooled CCD camera Hamamatsu Orca-ER. CFP and YFP images were taken every 20 min with a mercury lamp. CFP filter set: 436 nm/20 nm; 455-nm dichroic beam splitter, and 480-nm/40-nm emission. YFP filter set:

500-nm/20-nm excitation, 515-nm dichroic beam splitter, and 535-nm/30-nm emission (Chroma). The mCherry filter set: 560 nm/40-nm excitation, 585-nm dichroic beam splitter, and 630-nm/75-nm emission (Chroma). Images were acquired using MetaMorph software (Molecular Devices) for 48 h.

Cell Tracking and Fluorescence Quantification. Cell nuclei in the brightfield images were tracked manually in every frame using ImageJ (National Institutes of Health). Mean nuclear fluorescence intensity was measured using custom written MATLAB software (Mathworks Inc.), which measured and subtracted each image background fluorescence and excluded nucleolar regions from each tracked nucleus. Because of autofluorescence caused by the rounding up of cells near times of cell division, the fluorescence signal was masked and interpolated for 2 h before and after cell-division events.

Data Processing and Automated Pulse Identification. Trajectories were smoothed by Blaise filtering as described in refs. 16 and 17. To identify pulse maxima and minima, trajectories were processed by reducing the depth of local minima by 0.2 fluorescence units and performing the morphological opening operation with a width of three time-points to exclude short, noisy fluctuations in amplitude. Maxima were identified from the processed trajectories using the watershed algorithm; minima were identified using the watershed algorithm on the negative reflection of the processed trajectory. For all data analysis, we followed the dynamics of only a single daughter cell after each cell-division event to avoid bias arising from correlations between daughter cells.

Computational Methods. For all simulations, numerical integration was performed in MATLAB using ordinary differential equations 15s (The Mathworks). All computational analyses were carried out using custom written software in MATLAB, which is available upon request.

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