



A CRISPR/Cas9-based central processing unit to program complex logic computation in human cells

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Controlling gene expression with sophisticated logic gates has been and remains one of the central aims of synthetic biology. However, conventional implementations of biocomputers use central processing units (CPUs) assembled from multiple protein-based gene switches, limiting the programming flexibility and complexity that can be achieved within single cells. Here, we introduce a CRISPR/Cas9-based core processor that enables different sets of user-defined guide RNA inputs to program a single transcriptional regulator (dCas9-KRAB) to perform a wide range of bitwise computations, from simple Boolean logic gates to arithmetic operations such as the half adder. Furthermore, we built a dual-core CPU combining two orthogonal core processors in a single cell. In principle, human cells integrating multiple orthogonal CRISPR/Cas9-based core processors could offer enormous computational capacity.

synthetic biology | biocomputing | genetic engineering

In the physiological context, cells sense environmental inputs, such as metabolites, growth factors, or bacterial toxins, and respond through outputs, such as development, differentiation, or an immune response. These outputs are modulated via the regulation of specific gene switches by intrinsic programmed gene circuits. On the other hand, from the viewpoint of synthetic biology, the idea of introducing synthetic gene circuits into cells to achieve a range of desired nonphysiological outputs opens up many exciting possibilities, including the use of suitably engineered cells to conduct computational operations. Indeed, gene circuits performing basic Boolean logic operations in mammalian cells are already available (1–5). However, the creation of more complex gene circuits with sophisticated computational functions remains challenging due to the difficulty of combining multiple core regulation processors into one processing unit. The recently developed Clustered Regularly Interspaced Short Palindromic Repeats/CRISPR-associated protein 9 (CRISPR/Cas9) technology is a highly effective genome-engineering tool for developing synthetic gene circuits (6–12). Here, we used it to develop a CRISPR-based central processing unit (CRISPR-CPU), employing a Cas9-based transcriptional regulation system as a core processor, with synthetic gene circuits utilizing guide RNAs (gRNAs) and corresponding promoters. We then applied this system to generate programmable gene circuits in mammalian cells.

One application of the CRISPR/Cas9 system is based on a catalytically inactive form of Cas9 (dead Cas9, dCas9), which functions as a customized DNA-binding protein relying on gRNA sequences to regulate the transcription of a specific target sequence (13). We constructed several transcriptional switches, using gRNA as an input. In the CRISPR-CPU, the Krueppel-associated box protein of the human *kox-1* gene (KRAB) domain, fused to dCas9, served as a transcriptional master repressor (Fig. 1). The repression-based system outperformed dCas9 lacking the KRAB domain and performed as efficiently as the activation-based system (*SI Appendix, Figs. S1 and S2*). Two to four repeats of gRNA binding sequences and the 5'-NGG-3' protospacer adjacent motif (PAM) were inserted as the “operator,” representing the transcriptional regulatory unit (Fig. 1). For gRNA expression, we adapted an endogenous tRNA-processing system that ensures elimination of

the 5'-flanking region sequence of the primary transcript. We designed tRNA-gRNA units by inserting the tRNA sequence between the human U6 (hU6) promoter and the gRNA sequence. The primary transcript is recognized by RNase P and RNase Z, and processed into mature gRNAs carrying the desired 5'-target sequences without extra nucleotides (14). Constructs with tRNA showed comparable activity to that of constructs without tRNA (*SI Appendix, Fig. S3*), and enhanced the performance of the regulatory gRNAs (*SI Appendix, Fig. S4*). This approach was used to build systems with a variety of computational functions, as follows.

The OFF system consisted of three core components, namely dCas9-KRAB, an input gRNA (igRNA), and a reporter construct with binding sites for igRNA between the human cytomegalovirus immediate-early (hCMV) promoter and the transcription start site (TSS). In the OFF system, constitutively expressed dCas9-KRAB inhibited transcription of the reporter gene only in the presence of igRNA (Fig. 1 and *SI Appendix, Fig. S5*). The ON system consisted of four constructs: dCas9-KRAB, an igRNA, a regulatory gRNA (rgRNA) with binding sites for the igRNA between the hU6 promoter and the TSS of the rgRNA, and a reporter construct with binding sites for the rgRNA. In the ON system, rgRNA transcription is blocked by igRNA, so that the reporter gene is turned on only in the presence of igRNA (Fig. 1 and *SI Appendix, Fig. S6*). To test the performance of the ON/OFF switches, we introduced dCas9-KRAB, gRNA, and reporter plasmids into HEK-293T cells and measured fluorescent protein levels at 48 h posttransfection as an output. We observed significant repression and activation in the OFF and ON systems, respectively (Fig. 1 and *SI Appendix, Figs. S5 and S6*). We

Significance

By enabling rational programming of mammalian cell behavior, synthetic biology is driving innovation across biomedical applications. Using Cas9-variants as core as protein-based central processing units (CPUs) that control gene expression in response to single-guide RNAs as genetic software, we have programmed scalable Boolean logic computations such as the half adder in single human cells. Combining orthogonal Cas9-variants enabled the design of multicore genetic CPUs that provide parallel arithmetic computations. The Cas9-based multicore CPU design may provide opportunities in single-cell mammalian biocomputing to provide biomedical applications.

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observed correct circuit performance after 24 h, although the performance was improved after 48 h (*SI Appendix, Fig. S7*). For a single reporter gene controlled by a gRNA, we observed dose-dependent repression (*SI Appendix, Fig. S8*). However, if a cell received the full set of constructs, the designed circuit function was executed and the output was produced in a switch-like manner. Furthermore, fusing a domain for auxin-induced protein degradation to the output protein enabled us to switch off the circuit by the addition of a small molecule (indole-3-acetic acid, IAA). In the absence of auxin, the circuit operated as usual. Addition of auxin shut off the circuit within 4 h, while removal of auxin from the medium restored the circuit function (*SI Appendix, Fig. S9*).

We tested whether the inhibitory effect of rgRNA-R₁ by igRNA-I_A is enhanced by the subsequent introduction of the plasmids. We introduced all ON-system components except rgRNA-R₁ which was transfected 6 h after the first transfection. We observed that igRNA-I_A enabled the reactivation of reporter gene expression by repression of rgRNA-R₁ via cotransfection. However, a high leakiness was observed in time-delay transfection (*SI Appendix, Fig. S10*). Therefore, we used cotransfection methods for all following experiments.

We chose 4 gRNAs that were highly specific and not subject to intergRNA interference (*SI Appendix, Fig. S11*). CRISPR-mediated transcriptional ON/OFF switches as shown here can be used as building blocks for synthetic gene circuits. The processing unit consists of only one core processor with one master protein (dCas9-KRAB). In principle, such a single processor using orthogonal gRNAs can achieve a capacity of multiple bits.

Next, we designed an A NOR B gate, which is only active in the absence of both igRNAs [**Input (A:0, B:0) = Output (1)**], by combining two OFF systems. Binding sites for two igRNAs, located between the promoter and TSS of the reporter gene, allowed for repression of reporter gene transcription in the presence of either igRNA-I_A or -I_B. This gate provided 15- to 30-fold activation when neither of the two inputs was present (Fig. 2 and *SI Appendix, Fig. S12*). For an A NIMPLY B gate (A ANDNOT B), which is exclusively induced in the presence of only one specific igRNA [**Input (A:1, B:0) = Output (1)**], we combined one OFF system and one ON system. We generated a reporter plasmid containing binding sites for igRNA-I_A and rgRNA-R₁, which could be repressed by igRNA-I_A. IgRNA-I_A and -I_B were able to perform without mutual interference, and rgRNA-R₁ was found to repress reporter gene transcription in the presence of igRNA-I_A, but not igRNA-I_B. The reporter gene could only be transcribed in the presence of igRNA-I_B (Fig. 2 and *SI Appendix, Fig. S13*). Next, we built an A AND B gate, which is induced only in the presence of both igRNAs [**Input (A:1, B:1) = Output (1)**], by combining two ON systems. As igRNA-I_A and -I_B repressed rgRNA-R₁ and -R₂, respectively, induction could be achieved by introducing both igRNAs (Fig. 2 and *SI Appendix, Fig. S14*). Furthermore, we were able to build complex logic functions by combining these simple logic gates. The combination of A NIMPLY B and B NIMPLY A gates generated an A XOR B gate, which integrates two different input signals and produces the output ON only if one of the inputs is present [**Input (A:1, B:0; A:0, B:1) = Output (1)**]. The circuit consisted of two rgRNAs and two reporters; the rgRNAs were repressed by igRNAs and transcription of the reporter gene was regulated by the combination of igRNAs and rgRNAs. High levels of transcription of the reporter were achieved only when one of the igRNAs was present (Fig. 2 and *SI Appendix, Fig. S15*).

Binary arithmetic is performed by combinational logic gates, of which the simplest is the half adder, which adds two inputs A and B and generates two outputs Carry (C_{OUT}) and Sum (S_{HA}). The AND gate, which determines the C_{OUT}, consisted of an mCherry reporter gene with binding sites for rgRNA-R₁ and -R₂. To calculate the S_{HA}, the XOR gate was constructed with two d2EYFP-expressing reporters and two rgRNAs, rgRNA-R₁ and -R₂, which

were used for the AND gates. One of the XOR reporters was repressed by igRNA-I_A and rgRNA-R₂, and the other was repressed by igRNA-I_B and rgRNA-R₁. The combination of A AND B gate and the A XOR B gate enabled cellular half-adder computations, controlled by the presence of igRNAs. In the absence of input, the cell yielded 0 for both outputs [**Input (A:0, B:0) = Output (C_{OUT}:0, S_{HA}:0)**]. The presence of only one input yielded 0 for C_{OUT} and 1 for S_{HA} [**Input (A:0, B:1; A:1, B:0) = Output (C_{OUT}:0, S_{HA}:1)**]. When both inputs were present, both outputs were 1 [**Input (A:1, B:1) = Output (C_{OUT}:1, S_{HA}:1)**] (Fig. 2 and *SI Appendix, Fig. S16*).

We also built dual-core synthetic circuits in single cells by combining two orthogonal CRISPR-based core processors (Fig. 3). In addition to the usual dSpCas9-KRAB, we used *Staphylococcus aureus*-derived SaCas9 to construct dSaCas9-KRAB as a second, orthogonal computation core, which performed as efficiently as dSpCas9-KRAB (*SI Appendix, Fig. S17*). Recognizing the PAM sequence 5'-NNGRRT-3', SaCas9 can be used orthogonally with SpCas9. By using dSpCas9-KRAB as the first computation core regulating the software of the second core consisting of dSaCas9-KRAB, we could construct dual-core CPU ON switches (Fig. 3) as well as a NIMPLY gate (Fig. 3). Importantly, the dual-core NIMPLY gate also functioned in immortalized human mesenchymal stem cells (hMSCs), suggesting potential applicability of this system for therapeutic applications (*SI Appendix, Fig. S18*).

One important advantage of this CRISPR-mediated transcriptional regulation system is its efficiency; most transcription-control devices consist of two components: a DNA-binding domain specific for an operator sequence and a transcriptional regulatory domain functioning as a transcriptional activator or repressor (15). To recognize a specific operator sequence, the corresponding DNA-binding protein must physically associate with the DNA operator. However, as dCas9-KRAB serves as the transcriptional master repressor in the present system, its binding specificity is solely reliant on gRNA. Compared with synthetic DNA-binding domains, the generation of gRNA is both cost-effective and user-friendly, and future users can easily modify and extend the existing circuits. In this context, the tRNA-expression system is essential to enable us to build up gene circuits by adding multiple layers of regulation by regulatory gRNAs. For consistency, we equipped all gRNA constructs with the tRNA-processing system, as the compatible structure facilitates the modularity of circuit design. Additionally, as gRNA is itself used as an input signal, the system does not require additional induction. Another advantage of CRISPR-mediated transcriptional regulation is the orthogonality of custom-designed gRNAs and their corresponding promoters (9): Each gRNA-promoter set represents a basic unit for building up circuits, and these units can be easily combined to generate multiple layers of regulation for transcriptional control. The modular nature of CRISPR-CPU should even allow for a predictive in silico design of biocomputing circuits. In the future, circuits with even greater complexity may be achieved by using orthogonal dCas9 (16) or CRISPR-Display (17). Indeed, by adding orthogonal CRISPR-based core processors, we established dual-core synthetic circuits in single cells. Thus, we believe this platform has the potential to introduce multicore processing units, which can be considered as CPUs in the biological-computational realm, into single cells. Furthermore, this technique may be applied to both transiently transfected and endogenous gene circuits (18), providing a potential therapeutic approach for diseases caused by the dysregulation of transcriptional networks (19).

In electronics, adders form the main component of the arithmetic logic unit and therefore are an integral part of processor chips. Generating circuits that can perform an adder function in biological systems is a significant step toward realizing biocomputing systems. For this purpose, the cell may be loaded with custom-programmed circuits, enabling the performance of various functions, as a "biocomputing core." Each single cell can be considered a single-bit

supplemented with 10% heat-inactivated FBS (Invitrogen) and 1% penicillin/streptomycin (Biowest) at 37 °C in a 5% CO₂ environment. $1.0 \times 10^5/4.0 \times 10^5$ cells per well were plated in 500 μ L/2 mL of media in a 24-well/6-well plate. A total plasmid mass of 1–4 μ g per well was transfected using 3–12 μ L per well of polyethylenimine (1 mg/mL). At 24 h after plating, cells were transfected with plasmid DNA as indicated in *SI Appendix, Tables S2 and S4*. The plasmid ratio and amount transfected are provided in *SI Appendix, Tables S2 and S4*.

Luciferase Reporter Gene Assay. The expression levels of P_{HER2}-driven luciferase reporter were assessed 48 h posttransfection. The luciferase profiling was performed according to the following protocol. Initially, growth medium was removed from all of the wells. Subsequently, 60 μ L of $1 \times$ Lysis reagent (E1531, Promega) was added. After observing cell detachment, 200 μ L of Luciferase Assay Reagent was supplemented. Luciferase Assay Reagent was prepared by 10 \times dilution of 5 mM D-luciferin (potassium salt) solution (Art.-Nr. M03620-250MG, Chemie Brunschwig AG) together with complete DMEM. Immediately, $2 \times 125 \mu$ L were transferred to two separate wells on 96-well black plate (μ Clear-Boden, Art.-Nr. 7.655 090, Greiner Bio One). The luminescence signal was quantified using an Envision 2104 multilabel plate reader (Perkin-Elmer).

Flow Cytometry. Cells were washed twice with ice-cold PBS and harvested with 200 μ L of FACS buffer (1% BSA and 0.5 mM EDTA in PBS) 3 d after transfection. Flow cytometry analysis was performed using a BD FACS Fortessa flow cytometer. A 488-nm diode laser was used for the detection of d2EYFP, a 688-nm diode laser was used for the detection of mCherry, and a 633-nm diode laser was used to detect the iRFP transfection control. In each sample, viable singlet HEK-293T cells were gated via forward-scatter laser and side-scatter and at least 10,000 cells were analyzed as iRFP-positive cells (*SI Appendix, Fig. S19*). The collected data were analyzed using FlowJo (TreeStar) software. The data represent the results of at least two independent experiments.

Fluorescence Imaging. Fluorescence and time-lapse microscopy was performed with an inverted fluorescence microscope (Nikon Ti-E, Nikon) equipped with an incubation chamber, an Orca Flash 4 digital camera [Hamamatsu a pE-100-LED (CoolLED)] as the transmission-light source, a Spectra X (Lumencor) as the fluorescent-light source and a 10 \times objective (Plan Apo λ ; numerical aperture, 0.45; DIC N1; working distance, 4). Bright-field images (3% intensity, 90-ms exposure), d2EYFP fluorescence images (excitation, 513/17 nm; intensity, 50%; exposure, 200 ms; YFP ET filter, dichroic 520 nm; emission, 543/22 nm), and mCherry fluorescence images (excitation, 549/15 nm; intensity, 50%; exposure, 200 ms; CY3 HC, dichroic 562 nm; emission, 593/40) were collected. A binning of 2×2 was used.

Auxin-Induced Degron Experiments. DNA was transfected into 2.5×10^5 HEK-293T cells seeded the day before in a 24-well plate. After 48 h, fluorescence was measured in one set of wells and 500 μ M IAA, in ethanol, SigmaAldrich I3750-5G-A) were added to the remaining wells. Four hours later, fluorescence was measured in the next set of wells. The last set of wells was washed twice with normal DMEM, the medium was exchanged to DMEM, and 6 h later, the fluorescence in these wells was measured.

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- Xie M, Fussenegger M (2015) Mammalian designer cells: Engineering principles and biomedical applications. *Biotechnol J* 10:1005–1018.
- Bonnet J, Yin P, Ortiz ME, Subsoontorn P, Endy D (2013) Amplifying genetic logic gates. *Science* 340:599–603.
- Gaber R, et al. (2014) Designable DNA-binding domains enable construction of logic circuits in mammalian cells. *Nat Chem Biol* 10:203–208.
- Weinberg BH, et al. (2017) Large-scale design of robust genetic circuits with multiple inputs and outputs for mammalian cells. *Nat Biotechnol* 35:453–462.
- Ausländer S, Ausländer D, Müller M, Wieland M, Fussenegger M (2012) Programmable single-cell mammalian biocomputers. *Nature* 487:123–127.
- Nissim L, Perli SD, Fridkin A, Perez-Pinera P, Lu TK (2014) Multiplexed and programmable regulation of gene networks with an integrated RNA and CRISPR/Cas toolkit in human cells. *Mol Cell* 54:698–710.
- Chavez A, et al. (2015) Highly efficient Cas9-mediated transcriptional programming. *Nat Methods* 12:326–328.
- Kiani S, et al. (2015) Cas9 gRNA engineering for genome editing, activation and repression. *Nat Methods* 12:1051–1054.
- Didovik A, Borek B, Hasty J, Tsimring L (2016) Orthogonal modular gene repression in *Escherichia coli* using engineered CRISPR/Cas9. *ACS Synth Biol* 5:81–88.
- Gander MW, Vrana JD, Vojte WE, Carothers JM, Klavins E (2017) Digital logic circuits in yeast with CRISPR-dCas9 NOR gates. *Nat Commun* 8:15459.
- Kiani S, et al. (2014) CRISPR transcriptional repression devices and layered circuits in mammalian cells. *Nat Methods* 11:723–726.
- Gao Y, et al. (2016) Complex transcriptional modulation with orthogonal and inducible dCas9 regulators. *Nat Methods* 13:1043–1049.
- Gilbert LA, et al. (2013) CRISPR-mediated modular RNA-guided regulation of transcription in eukaryotes. *Cell* 154:442–451.
- Xie K, Minckenberg B, Yang Y (2015) Boosting CRISPR/Cas9 multiplex editing capability with the endogenous tRNA-processing system. *Proc Natl Acad Sci USA* 112:3570–3575.
- Ausländer S, Fussenegger M (2016) Engineering gene circuits for mammalian cell-based applications. *Cold Spring Harb Perspect Biol* 8:a023895.
- Esvelt KM, et al. (2013) Orthogonal Cas9 proteins for RNA-guided gene regulation and editing. *Nat Methods* 10:1116–1121.
- Shechner DM, Hacisuleyman E, Younger ST, Rinn JL (2015) Multiplexable, locus-specific targeting of long RNAs with CRISPR-Display. *Nat Methods* 12:664–670.
- Zalatan JG, et al. (2015) Engineering complex synthetic transcriptional programs with CRISPR RNA scaffolds. *Cell* 160:339–350.
- Schukur L, Fussenegger M (2016) Engineering of synthetic gene circuits for (re-)balancing physiological processes in chronic diseases. *Wiley Interdiscip Rev Syst Biol Med* 8:402–422.
- Liu Y, et al. (2014) Synthesizing AND gate genetic circuits based on CRISPR-Cas9 for identification of bladder cancer cells. *Nat Commun* 5:5393.
- Li Y, et al. (2015) Modular construction of mammalian gene circuits using TALE transcriptional repressors. *Nat Chem Biol* 11:207–213.