Tools and Principles for Microbial Gene Circuit Engineering

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Abstract

Synthetic biologists aim to construct novel genetic circuits with useful applications through rational design and forward engineering. Given the complexity of signal processing that occurs in natural biological systems, engineered microbes have the potential to perform a wide range of desirable tasks that require sophisticated computation and control. Realising this goal will require accurate predictive design of complex synthetic gene circuits and accompanying large sets of quality modular and orthogonal genetic parts. Here we present a current overview of the versatile components and tools available for engineering gene circuits in microbes, including recently developed RNA-based tools that possess large dynamic ranges and can be easily programmed. We introduce design principles that enable robust and scalable circuit performance such as insulating a gene circuit against unwanted interactions with its context, and we describe efficient strategies for rapidly identifying and correcting causes of failure and fine-tuning circuit characteristics.

Introduction

Microbes are capable of sensing a wide variety of stimuli, processing information efficiently, and producing a range of chemical and physical responses. Genetic engineers have repurposed these impressive capabilities to interrogate natural biological signalling pathways \cite{1} and have reprogrammed cells to produce desirable compounds \cite{2}, to sense and report on the presence of toxic metals \cite{3} or cancer \cite{4}, or to seek and destroy pathogenic bacteria \cite{5,6}. These state-of-the-art examples use relatively simple signal processing networks compared to complex native systems, hinting at the great potential for designer organisms but also highlighting how difficult it currently is to effectively and routinely program synthetic gene circuits \cite{7,8}.

Synthetic biology has often adopted an electrical engineering framework for the design of novel gene networks: basic functional units are termed parts \cite{9,10} and can be connected to build circuits, input–output responses are described as having analogue or digital characteristics \cite{11,12}, and signal processing is often implemented using Boolean logic functions \cite{13}. This conceptual framework is effective up to a point, but predictions of how gene circuits will behave often fail when they are implemented in living cells because of the many undefined, complex and dynamic interactions that can occur between the circuit and its context \cite{14,15}. Functional circuits can still be produced, using iterative cycles of testing and refinement to correct failures, and strategies for insulating parts from confounding contextual effects are being developed \cite{16,17}, but the inability to accurately model circuit behaviour remains a major barrier to the construction of large gene circuits.

Another limiting factor for the construction of complex synthetic gene circuits has been a lack of large sets of appropriately characterised parts, though this has changed in recent years \cite{18–22}. Desirable properties of part families include specificity and orthogonality (strong interactions with...
cognate parts, without cross-talk), compatibility (can be used in the same circuit), and composability (possessing transfer functions that overlap with other parts) [7]. Parts whose function can be designed de novo are particularly amenable to the creation of large orthogonal sets [18–20].

In this review, we describe the current tools and principles available for microbial gene circuit engineering (Table 1), starting with regulators of transcription and translation, two major control points that determine the levels of gene circuit components, and their associated final outputs in a cell. Large sets of orthogonal regulatory parts have been generated [18–22], though recently developed RNA-based tools show particular promise as effective, reusable components for gene circuit engineering. The specificity of RNA-based tools is defined by base-pairing, making design conceptually simple and amenable to computational modelling. Both the CRISPR-dCas9 [19] and the toehold switch [20] part families have dynamic ranges of over two orders of magnitude and have few constraints on their programmability. Tools for post-transcriptional and post-translational signal processing are also discussed, including split inteins for protein splicing [23], the use of scaffolds for coordination of pathways [24], and memory elements [12,25]. Since gene circuits often do not function as expected when they are assembled, we discuss how context effects impact on circuit function [14,15] and how circuits can be insulated against these effects [16,17]. Finally, we look at practical strategies for debugging and tuning circuits to meet design specifications [8,26].

Tools for Engineering RNA Levels

Transcription is arguably the most important control point for a gene circuit. It provides comprehensive regulation over the levels of each component since not all RNAs go on to be translated. The tools available for RNA-based signal processing are increasing in number and capability [18–20,27]. The vectorial nature of transcription gives rise to polar effects, some of which can be useful (e.g., coordination of gene expression as a polycistronic RNA), whilst others are undesirable (read-through of terminators [28]). Control elements are more easily composed at the DNA level [29], avoiding problems that may be caused by secondary-structure formation in mRNA [16,30]. Regulation of transcription affords an efficient use of cellular resources compared to the downstream regulation of translation, as energy and resources are not wasted on RNA synthesis. Here we review and discuss the versatile components, tools, and approaches available to achieve transcription-based gene circuit design in microbial cells. Most transcriptional regulation components control the initiation of RNA synthesis, by modulating RNA polymerase (RNAP) binding affinity with the promoter DNA [31,32], stabilising initiation complex formation [33], or controlling access to a promoter [19,21].

RNAP binding

The nucleotides in a promoter sequence that interact with the RNAP holoenzyme are fundamental determinants of the transcription rate from that site. Sequence-dependent binding occurs between the σ70-type factors and the −10 and −35 (core) regions to specify the initiation site, whilst the C-terminal domains of the α subunits preferentially interact with short tracts of repeated A or T nucleotides in the 30 base pairs upstream of the −35 region (the UP element), influencing promoter strength [34] (Fig. 1a). Various studies have explored how changes to and between the −10 and −35 regions influence σ70-type promoter strength [35,36], with thermodynamic modelling of the binding energies proving one useful predictor for promoter strength [31]. An examination of the contribution of the UP element to σE promoter strength revealed the importance of RNAP concentration for models of the full-length promoter: the influence of the UP element decreased with increasing RNAP concentration for promoters with a strong core sequence and vice versa [37]. The sequence downstream of the transcription start site can also influence transcription rates; potentially interfering effects can be avoided using a standardised 5’ untranslated region (UTR) and a constant initiating nucleotide [17,38]. The libraries of promoter sequences created for these studies and others [17,39,40] span a large range of strengths, making them a useful resource for biological engineers until fully predictive models of promoter activity are built.

Protein transcriptional regulators

Activators

Classical activators used in gene circuit design, such as LuxR [41], work by stabilising RNAP binding to the promoter. Taking a different approach, Rhodius and colleagues used part mining of extracytoplasmic function σ factors (ECFs) to build the largest library of orthogonal protein transcriptional activators available for use in Escherichia coli, finding 20 ECFs and cognate promoters that show low cross-reactivity [32]. These proteins function by determining the specificity of RNAP for a given promoter sequence, interacting at the −35 and −10 regions. The authors take advantage of this property to produce synthetic chimeric ECFs, a strategy that they estimate could produce a total set of approximately 160 orthogonal ECF promoter pairs. ECF
function can also be inhibited through their sequestration by an anti-σ factor; thus, anti-σ factors can be used to lower the OFF state and tune the activation of promoters (alter the cooperativity) by their cognate ECF. Effective anti-σ repressors of all 20 orthogonal ECFs were identified, though some cross-reactivity to non-cognate ECFs was observed. Rhodius et al. characterise the dynamic range, response function, and toxicity of the parts, making this a rich resource for biological engineers.

Other useful transcriptional activators for use with the native E. coli RNAP include three chaperone-activator pairs (which can be used for AND logic) [42], phage transcriptional activators [43], and the HrpRS bacterial enhancer binding proteins [44] (which can be used in combination with the HrpS-inhibiting HrpV protein [45]). HrpRS activates transcription from the σ^54-dependent P_hrpL promoter in an ATP-dependent manner [46,47]. Hence, contrasting to σ^70-dependent transcription, there is no spontaneous open complex formation and P_hrpL is not recognised by the σ^70-RNAP holoenzyme, which renders the OFF state of the P_hrpL promoter close to zero, facilitating a digital-like response upon activation [48].

### T7 RNAP

The native E. coli RNAP is not necessarily required for transcription: the phage T7 RNAP is a single-subunit enzyme capable of high transcription rates, which recognises promoter sequences that are orthogonal to those used by the native E. coli RNAP. Promoter recognition is determined by a “specificity loop” in the enzyme, which a number of groups have modified to produce variants that exhibit differing degrees of selectivity to a given promoter sequence: highly orthogonal sets [49,50] allow for modular control, whilst cross-talk between other combinations of polymerases and promoters could also be useful for differential control of multiple genes [51,52]. The T7 RNAP coding sequence can be split into parts that interact—either spontaneously [51] or more stably via split-intein-mediated trans-splicing [23]—to form a functional enzyme. T7 RNAP that is split into two enables basic AND logic [23,51] or analogue addition functions to be incorporated into a gene circuit, though the enzyme can be split into up to four sections [52]. Segall-Shapiro and colleagues demonstrated the use of tripartite T7 RNAP as a “resource allocator”, where the expression level of an N-terminal “core” enzyme fragment determines the total level of transcriptional resources available, thereby setting an upper bound on the metabolic load imposed on the cell by actively transcribing synthetic gene circuits [52]. Differential expression of C-terminal “σ” domain fragments that contain orthogonal specificity loops then controls the distribution of the transcriptional resources across an array of target promoters. Positive post-transcriptional regulation of the total T7 RNAP transcriptional resource level is achieved by splitting the core fragment further into “α” and “β” subunits; expression of the α subunit can then be titrated against the constitutively expressed β subunit to control the amount of the holocore fragment. Conversely, sequestration of the core fragment using an inactive version of the σ domain enables negative regulation of total transcription.

### Repressors

Transcription-repressing proteins most commonly act by blocking RNAP access to the promoter (Fig. 1a). A library of homologues of the DNA binding protein TetR and their cognate operator sequences was built by Stanton et al., and it contains 16 orthogonal variants sourced from sequence databases [21]. The response function and toxicity of the repressors was characterised, providing useful data for gene circuit design. The authors note that, theoretically, a set of 130 orthogonal variants for this repressor class exists [53]. A smaller library of LacI variants has also been produced [54], which can be used for NAND logic at a promoter due to the cooperative nature of LacI-induced DNA looping.

The DNA binding specificity of certain families of proteins can be predicted and programmed [55,56]; the DNA binding domain of transcription activator-like effectors (TALEs) comprises multiple 34-amino-acid repeats that each have two residues that interact with the DNA major groove. Since the amino acid-nucleotide recognition code is known, repeats can be assembled to create a protein with predictable DNA sequence-specific binding, TALE repressors are more easily programmed compared to zinc-finger DNA binding proteins [57,58], can be used for multiplexed gene control [59], and have been shown to provide over 100-fold repression of gene expression in E. coli [60], but to date, they are a poorly represented class of components in E. coli gene circuits. This may be due to the relative difficulty in assembling the coding sequence of the binding repeats—though high-throughput methods have been developed for TALE synthesis [61–63]—or possibly due to the emergence of CRISPR-Cas9 technology.

### Inducible control of transcription

#### Small-molecule control: Protein regulators

Transcriptional regulators that are controlled by small-molecule inducers are indispensable to designers of synthetic gene circuits, allowing simple and often cheap external control over mRNA production rates and facilitating cell-to-cell communication in the case of quorum-sensing molecules [64]. A few “classical” regulators (usually proteins) that sense inputs ranging from metabolites to metal
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Beyond transcription and translational control

- **Protein splicing**: Split intein used to form a peptide bond between two proteins [144]. Two- and three-way splicing is possible.
- **Protein cleaving**: Can be used to release a sequestered factor [148]. Example uses the tobacco etch virus protease.
- **Protein scaffolds**: Protein binding domains used to immobilise and organise enzymes [150,24,154]. Stoichiometry and relative position on the scaffold can be controlled.
- **RNA scaffolds**: CRISPR guide RNAs or multi-dimensional RNA structures as scaffolds for protein binding [101,155]. CRISPR guide RNAs can recruit proteins to DNA; multi-dimensional RNA scaffolds spatially organise metabolic pathways.
- **Inducible association of proteins**: Target proteins are fused to signal-responsive interacting domains [134,156–158]. Interacting domains that respond to small molecules or light are available.
- **DNA modification for memory**
  - **Recombinases**: Recombinases flip a section of DNA [162–164]. Memory elements can be nested or concatenated; excisionases can be employed to reverse DNA flipping.
  - **Retron-encoded analogue memory**: ssDNA produced in response to a signal is incorporated into the genome at a replication fork [25]. DNA changes can be targeted to any unique sequence in the genome; recombination frequency is proportional to ssDNA expression level.

In the absence of a characterised sensing system for a metabolite of interest, it may be possible to find native promoters that respond to the molecule via global transcript profiling. Dahl et al. pioneered this approach, using microarrays to identify promoters that are differentially activated in response to the toxic intermediate farnesyl pyrophosphate in the isoprenoid biosynthesis pathway [68].

Small-molecule control: Riboswitches

Small-molecule control over transcription can also be achieved using riboswitches. These structures in the 5′ UTR of an mRNA contain a regulatory domain that undergoes restructuring upon ligand binding to an adjacent aptamer domain. The resulting structural change may either repress or activate transcription [27,69]. Cis-elements that control the formation of a transcription terminator hairpin have been demonstrated in **E. coli** that are responsive to, for example,
theophylline [70], guanine [71], and S-adenosylmethionine [72], albeit with fold changes of less than two orders of magnitude. Riboswitch engineering has produced aptamers that sense unnatural compounds that are orthogonal to the cell’s metabolism [73,74], though the variety of ligands sensed by riboswitches is limited in general [69]. In vitro screening and selection methods for aptamers with novel binding properties are well established [75], but further development of complementary experimental [76] and rational design [71,72] strategies for transferring these properties into effective in vivo riboswitches is required [77].

Liu et al. demonstrated a scalable design for small-molecule control of transcription, using unnatural amino acid (UAA) concentration to either positively or negatively regulate the transcription of

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Fig. 1 (legend on next page)
downstream genes [78]. Both activating and repressing control regions feature a leader peptide gene containing UAA codons; if the corresponding UAA-charged tRNA is absent, the ribosome will stall. The positively regulated design, based on the tna operon, then features a Rho transcription termination sequence ahead of then the regulated genes; if the leader peptide is translated without ribosome stalling (UAAs available), the Rho binding site is blocked, and translation of downstream genes occurs. The negatively regulated design, based on the tpr operon attenuator, replaces the Rho binding site with a structured RNA region that forms a transcription termination hairpin if the leader peptide is translated without stalling. These designs are scalable, being programmed by the type of UAA incorporated in the leader peptide, and possess 10- to 100-fold dynamic ranges in their output.

Optogenetics

Light is an orthogonal signalling medium for many bacteria and is of particular interest for industrial applications where the addition of a chemical inducer is expensive or would contaminate the product. Red-light-sensing and green-light-sensing transcriptional activating systems that can work in tandem have been engineered, using the chimeric Cph1-EnvZ/OmpR (red) [79,80] and the unmodified CcaS/R (green) [81] two-component histidine kinase signalling pathways. Additionally, the blue-light-responsive YF1/FixJ two-component system has been engineered into light-activating and light-repressing configurations [82].

RNA control of transcription

A major strength of RNA-based parts for gene circuits is that they are amenable to in silico design: thermodynamic models are able to make good predictions of the secondary structure of, and interactions between, small trans-acting RNAs (taRNAs) and their cognate cis-elements [27,83,84]. The simple composition of RNA aids design but is also a relative weakness: proteins are more chemically diverse and consequently may be able to interact with a more diverse set of ligands and with a greater span of binding affinities [27]. Protein-based regulators generally exhibit greater dynamic ranges and stronger levels of repression and have longer half-lives [27]. However, the larger sequence and chemical diversity of proteins makes their interactions much more difficult to model compared to RNA; consequently, RNA-based part families are likely to be preferred for the construction of complex large gene circuits in the near future [27,84].

With regard to transcriptional control, a number of variants of the pT181 transcription attenuation system have been developed for gene circuit control in E. coli: the native pT181 mechanism uses a structured 5′ UTR that forms a hairpin, normally allowing transcription elongation; a “kissing loop” interaction of a hairpin on the taRNA with the 5′ UTR hairpin promotes the formation of a downstream transcription terminator stem–loop structure [85] (Fig. 1b-i). Lucks and co-workers altered the terminator stem of the native system to increase the dynamic range of repression to five-fold and created three orthogonal hairpin/taRNA pairs by mutating the loop of the control hairpin [85]. Another 11 pairs were created in a later study using chimeras with hairpin elements from taRNA-controlled translational regulators [86]. Multiple regulators can be placed upstream of a coding region to create NOR logic or improve repression [85]. A further adaptation of the system introduced a small-molecule-sensing aptamer to the taRNA that interferes with the interacting hairpin in the ligand-unbound state; binding of the ligand frees the taRNA hairpin to interact with its cognate loop on the 5′ UTR hairpin region and inhibit translation [87] (Fig. 1b-ii). The design is modular and able to integrate different aptamers as long as the structure is known [87].

Recent work on the pT181 system has adapted it to enable taRNA activation of transcription, by changing the default secondary conformation to a stable transcription terminator. Small transcription activating RNAs (STARs) have been engineered to disrupt the terminator, either indirectly via interaction with an upstream hairpin structure or through direct interaction...
sequestration of one branch of the terminator stem [22] (Fig. 1b-iii). This positive regulation configuration of the pT181 system exhibits a higher dynamic range (94-fold) compared to the repressor and is equally amenable to concatenation for the creation of layered logic gates.

tRNAAs have also been incorporated into a modular regulator based on the previously described regulation of transcription via control over tna leader peptide translation [88]. The leader peptide functions as a modular “adapter”, allowing a number of both negative and positive translation regulation mechanisms to be used to control transcription, including the IS10 RNA-IN/RNA-OUT motif [18] that allows for nearly three orders of magnitude of transcriptional repression [88]. Multiple tna adapter units can be combined to control a single transcriptional output, though Csy4 processing is required to allow proper folding of RNA-IN cis-elements.

**CRISPR-dCas9 control of transcription**

Clustered regularly interspaced short palindromic repeat (CRISPR) systems recognise, remember, and destroy foreign nucleic acids, acting as immune systems in their hosts to defend against invading phage and plasmids [27,55,89]. Natural CRISPR systems comprise a set of DNA-encoded target sequences—the CRISPR array—which are transcribed and processed into guide RNAs. These RNAs target CRISPR-associated proteins to complementary sequences that are cleaved, allowing the specificity of CRISPR-associated protein binding to be programmed by modifying the sequence of the guide RNA. It is this function that makes adapted CRISPR systems such attractive tools for genetic engineering. The Cas9 protein from the *Streptococcus pyogenes* type II CRISPR system has been widely applied as a minimal functional unit for the recognition and cleavage of target double-stranded DNA for genome engineering [90–94] and in its mutant endonuclease-inactivated form dCas9 as a DNA binding protein [19,33]. Cas9 requires both a guide RNA and a tracrRNA (trans-activating CRISPR RNA) to function; the guide RNA can be expressed either as a crRNA (CRISPR RNA) as it is from the CRISPR array or as a fusion to the tracrRNA known as an sgRNA (small guide RNA) [95] (Fig. 1c-i). Target sequences must be directly downstream of a three-nucleotide “NGG” protospacer-adjacent motif (PAM) for recognition and cleavage to occur [96] (Fig. 1c-ii). Two recent efforts have produced split versions of Cas9 to achieve increased functionality: reformation of the functional enzyme can be mediated by small-molecule binding for rapid induction [97] or by using the sgRNA as a scaffold [98]. Here we will consider the use of dCas9 in bacterial transcriptional regulation.

CRISPR-based repression of transcription uses dCas9 to block RNAP access to a promoter or prevent transcription elongation—a property that most other repression mechanisms do not have, allowing transcription of downstream genes in a polycistronic unit to be selectively knocked down. The highest repression is achieved by targeting dCas9 to the transcription initiation region (especially the –35 box [19,33]) or the antisense strand close to the start of a target gene if preventing transcription elongation [19]. Repression is highly effective, up to 1000-fold when targeting a gene with two sgRNAs [19], and tuning of repression is also possible though the introduction of mismatches between the guide and target sequences or truncation of the guide [19,33]. The 12 bases of the guide RNA adjacent to the PAM are the minimal requirement for specificity [19], making it unlikely that off-target binding will occur in bacterial genomes [27]. Expression of multiple guide RNAs enables parallel control over multiple genes [19,99,100]. Guide RNAs can be expressed as a series of sgRNA transcriptional units: Nielsen and Voigt used Golden Gate assembly to combine multiple units for the construction of a gene circuit with three layers of sgRNA control [100]. Alternatively, Cress et al. employed type IIS restriction enzyme assembly for the construction of a synthetic array of crRNAs transcribed from one promoter, which was used to simultaneously repress three endogenous *E. coli* transcripts [99].

Transcription activation is also possible by fusing dCas9 to an activator protein. The only example so far in *E. coli* uses a fusion to the RNAP ω subunit, with dCas9 targeted approximately 90 base pairs upstream of the transcription start site [33]. Activation is modest (23-fold for a weak promoter, lower effects for stronger promoters) and requires a ΔrpoZ strain but might be improved through fusions with (multiple) alternative factors. Rather than using a direct fusion to dCas9, the guide RNA can be also used as a scaffold for hairpin binding proteins, which are themselves fused to an effector protein, enabling recruitment of different effectors to different sites [101].

**RNA degradation**

Targeted cleavage of mRNA molecules was demonstrated by Qi et al. who used and inserted an in-frame cognate sequence for the *Pseudomonas aeruginosa* CRISPR endoRNase Csy4 immediately downstream of the start codon, resulting in better than 10-fold repression of protein expression [16]. This method obviously is constrained by having to integrate the Csy4 target sequence into an open reading frame, but other CRISPR-based technologies may enable specific, programmable degradation of mRNA in the future: Mitchell and co-workers showed that, *in vitro*, the type II Cas9 endonuclease can be targeted to and cleave single-stranded RNAs by supplying the PAM motif *in trans* on a single-stranded DNA (ssDNA)
oligonucleotide [102]. As pointed out by Nelles et al., it has not been shown that this technique would work in vivo or that cleavage of DNA would not also occur [103]. The targeted RNA binding function of nuclease-inactivated Cas9 (RCas9) could still be very useful, and Nelles et al. suggest other potential applications for RCas9, including targeting proteins to an RNA that then acts as a scaffold, combining sensing with actuation [103]. Other CRISPR systems also show potential as programmable bacterial RNAi tools, for example, the Streptococcus thermophilus type III-A Csm complex, which was recently shown to preferentially cleave single-stranded RNA in vitro and repressed replication of the MS2 RNA phage when the components were expressed in E. coli [104]. Trans-acting elements are not necessarily required: Win and Smolke introduced a ligand-regulated self-cleaving ribozyme (aptazyme) into the 3′ end of an mRNA to control gene expression, using a modular design that can use different aptamer domains [105]; ligand binding could either disrupt or reinforce the ribozyme fold, modulating the self-cleaving activity.

RNA stability can be improved by protecting long single-stranded regions from RNase E degradation by introducing hairpin secondary structures [106,107]; RNA half-life in E. coli correlates somewhat with the folding energy of 5′ hairpins, indicating that this protection against RNase E is an important, but not exclusive, factor for RNA stability [108]. Stronger ribosome binding site (RBS) sequences also impart a small improvement in mRNA stability, presumably due to the bound ribosome blocking RNase access [40].

Tools for Engineering Protein Levels

In contrast to the multiple routes for regulating transcription, peptide synthesis rates are mostly accessible to regulation by RNA—both the mRNA template itself and taRNAs. Translation can begin at internal sites in the mRNA, allowing control over the initiation rates of individual reading frames within a polycistronic transcript.

Translation initiation control with designer RBSs

Translation initiation requires recognition of an RBS by the 30S ribosomal subunit, through base-pairing between the RBS and an anti-Shine–Dalgarno sequence encoded in the 16S ribosomal RNA (rRNA). The strength of the mRNA-rRNA interaction, as well as accessibility of the region to the ribosome, determines the likelihood of the translation complex forming and is an important control point for gene expression [109] (Fig. 2a). Thermodynamic models of translation initiation have been developed by a number of groups, which all show good predictive power [110–112]. These models have been implemented in computational tools that enable efficient sampling of a large range of translation initiation rates, allowing optimisation of protein expression levels in a synthetic biological system [107,113]. Farasat et al. demonstrated effective sampling of expression levels in different bacteria and also combined kinetic modelling of a biosynthetic pathway (which includes enzyme expression parameters) with translation initiation rate prediction to find variants with improved productivity [107]. A complementary approach using directed evolution rather than pathway modelling was employed in another study, combining RBS library design with the multiplex automated genome engineering (MAGE) recombineering method [114] to optimise a five-gene pathway, using 16 RBS variants for each gene that sampled a range of translation initiation rates spanning three orders of magnitude [115]. These translation initiation rate prediction tools are available online, for example, the RBS Calculator [116], which has been recently updated to incorporate parameters developed by Borujeni et al. [117].

Orthogonal ribosomes

Riboswitch recognition of the RBS in an mRNA occurs through base-pairing between the RBS and an anti-Shine–Dalgarno sequence encoded in the 16S rRNA, a fact that has been exploited to generate three additional orthogonal ribosomes with modified 16S rRNA that initiate translation only from mRNAs with cognate orthogonal RBSs [118]. Transcription of both the orthogonal rRNA and mRNA is required for gene expression, creating AND logic for greater control over the output [119]; the orthogonal rRNA could be considered a trans-activating RNA in this particular context. A practical consequence of the use of orthogonal RNAs is that the coding sequence of target mRNAs may need to be reconfigured to prevent pausing at Shine–Dalgarno-like sequences [120].

Riboswitches

Riboswitch control over translation occurs through ligand-dependent restructuring of the 5′ UTR of an mRNA to modulate access of the ribosome to the RBS [27,69]. As was discussed for transcriptional riboswitches, the range of ligands and the fold response are limited, but translational riboswitches have been employed successfully in synthetic microbial gene circuits, for example, to control chemotaxis [121]. Sharma et al. demonstrated that translation-controlling riboswitches can be combined to allow AND and NAND logic, though the composition required screening of variants (i.e., was not modular) [122]. Temperature-sensitive riboregulators of transcription (RNA thermometers) also act through control of RBS availability; an RBS occluded within secondary structures formed at low temperature becomes accessible at higher temperatures as the RNA melts [123].
**taRNA control of translation**

**Trans-repressing RNA control**

The mechanism of translation inhibition by small RNAs (sRNAs) is conceptually simple, making this method easy to implement: the sRNA contains a complementary sequence to the target mRNA, binding at or just downstream of the RBS to block the ribosome (Fig. 2a), with sRNA-mRNA binding energy correlated to repression strength [124]. In addition to the targeting region, a 3′ scaffold recruits the Hfq chaperone protein that stabilises the sRNA-mRNA interaction and promotes their degradation by RNase E [125]. Synthetic sRNAs that use the scaffold portion from an endogenous *E. coli* sRNA [124,126] with a designed 5′ antisense region may be designed: Na and colleagues used the MicC scaffold to make over 120 sRNAs, allowing them to repress multiple target metabolic genes and screen for increased productivity of a desirable compound [124]. Endogenous sRNAs target a range of locations on target mRNAs (i.e., not always the RBS) using a variable number of bases [126]; thus, the strategy employed by Na *et al.* of screening multiple sites on and around the translation initiation region of the target mRNA for effective repression may be advisable [124].

The native IS10 translation control system is composed of a taRNA (RNA-OUT) and a cognate RNA-IN sequence surrounding the RBS and start codon of the controlled mRNA. The free antisense RNA-OUT molecule contains an interacting hairpin, the loop of which initiates binding to the RNA-IN cis-element [18,20]. The structure of the 5′ and 3′ ends alters accessibility to RNases. (b) IS10-based translational repression: binding of the taRNA (RNA-OUT) and resultant occlusion of the RBS is initiated via interactions between its specificity loop (green) and the cognate sequence in the RNA-IN cis-element. (c) The toehold switch cis-element sequesters the RBS (red) and ORF start (blue) in a hairpin. Binding of the trigger taRNA initiates using the toehold region (purple) and displaces the hairpin to also bind the 5′ branch (orange), freeing the RBS.
The IS10 system has also been adapted for small-molecule sensing by adding an aptamer to the RNA-OUT sequence [87].

Trans-activating RNA control

Green et al. recently described the development of toehold switches, translation-blocking hairpins that sequester the RBS and start codon of a gene, with translation activation occurring through binding of a short (30–40 bases) trigger RNA that sequesters the upstream branch of the hairpin (similar to the mechanism of direct STAR transcription activation) [20] (Fig. 2c). Binding initially occurs to a single-stranded region 5′ of the hairpin (the “toehold”), and the hairpin is designed so that only the RBS and start codon need remain constant between different switches: the start codon is part of the 3′ branch of the hairpin, meaning a seven-amino-acid linker is added to the protein. Whilst alternative efforts to develop trans-activating RNA systems do not alter the coding of the regulated gene [127–129], the toehold switch design places very few constraints on the sequence when constructing trigger-switch pairs, potentially allowing the creation of a huge number of orthogonal pairs. The most effective toehold switches have a dynamic range of over 600-fold, an order of magnitude better than most other taRNA control mechanisms. Green et al. showed that multiplexed control over the translation of four fluorescent proteins transcribed as a single polycistronic mRNA is possible with minimal polar effects, demonstrating the potential for sophisticated control over synthetic gene networks. Endogenous genes can also be placed under the control of trigger RNAs by altering the chromosomal copy of the gene to introduce the regulatory hairpin, but this intervention could disrupt native regulation (of transcription as well as translation) [130]. Another application is to sense RNAs—the RNA being sensed is used as the trigger—which has been shown to work in cell-free, paper-based devices for sensing Ebola mRNA [131].

Protein degradation rate tuning

The concentration of a protein and dynamics of its expression may also be controlled via manipulation of its degradation rate. SsrA degradation tags of varying strength [132] are available, though these make use of host ClpXP machinery—a fact utilised by Prindle et al. to temporally coordinate protein expression with delay times of less than a minute [133]. Inducible degradation of proteins is also possible: SspB-dependent chaperoning of DAS-ssrA-tagged proteins for ClpXP degradation was made inducible by splitting SspB and fusing each half to FRB or FKBP12, two proteins that are brought together through binding rapamycin [134]; replacement of the native sspB promoter with an anhydrotetracycline-inducible promoter has also been demonstrated [135]. More recently, a hybrid system that can degrade proteins using either the native E. coli ClpXP or an inducible orthogonal Lon protease from Mesoplasma florum has been developed [136]. The 27-amino-acid M. florum ssrA tag was modified at the C-terminus to create a set of variants that are recognised by the endogenous E. coli degradation machinery to give a range of steady-state levels of a target protein whilst remaining an effective signal for M. florum Lon degradation. The efficacy of M. florum Lon degradation could also be modulated through variation of residues 13–15, creating a library of tags with a range of steady-state and inducible degradation rates.

Beyond Transcriptional and Translational Control

In addition to the regulation of RNA and protein synthesis, biological signal modulation also occurs through the interactions between and within these molecule classes (e.g., binding [32,45], chemical modification [137]), providing additional opportunities for control. Compared to transcription and translation, information transfer between interacting molecules can be extremely rapid and resource efficient [138].

Modulation of transfer functions

The HrpRSV system contains examples of protein/protein interactions that both amplify and diminish a signal: HrpR and HrpS form a heterohexamer that activates σ54-dependent transcription from the PhrpL promoter (allowing AND logic); inhibition of HrpS by HrpV negatively modulates the output from PhrpL, reducing the gain and dynamic range of the output [45,139] (Fig. 3a). The in trans inhibition by HrpV illustrates an important general strategy for lowering the OFF level of a signal and increasing the sensitivity of a response—a key property in biological circuits that require digital characteristics or bistability [11,26,137,140]. Briefly, in trans inhibition or sequestration may be designed into a gene circuit, for example, by introducing additional decoy binding sites for transcription factors [141], expressing specific sequestering proteins [32,45] or antisense RNAs [142]. Positive cooperativity also increases response sensitivity, occurring when ligand binding increases the binding affinity for subsequent ligands [143].

Splicing and cleaving

Splicing and cleavage reactions can be used for rapid, stable switching of function. Split inteins have been employed in a number of contexts for protein splicing, usually to reconstitute an active enzyme from two (or more [144]) inactive components [23,97,98] (Fig. 3b-i). RNA splicing also occurs in bacteria [145–147], though this function has not been adapted for use in synthetic gene circuits in vivo to the best of our
knowledge. Cleavage can be exploited for inactivation of a component, for example, RNA aptazyme-mediated self-cleaving [105], but it has also been used to activate signalling by releasing a sequestered transcription factor [148].

**Scaffolds**

An alternative to covalent fusing of components is to stabilise their interactions using a scaffold, enabling modular, predictable, and scalable organisation of substrate components. Protein scaffolds have been adapted to re-wire yeast signalling pathways [149] and built *de novo* to sense and control protein concentration [150]. There is much potential in using scaffolds (and micro-compartments [151,152]) to coordinate metabolic pathway enzymes: enzymes and intermediates are concentrated to minimise diffusion times of unstable intermediates [153], and the stoichiometry and position of components on the scaffold can be easily manipulated [24,154]. RNA scaffolds can be used in isolation, for example, CRISPR guide RNAs that act as scaffolds for transcriptional effectors [101], but they can also be engineered to produce sophisticated higher-order structures [130]: Delebecque *et al.* made use of two-dimensional RNA scaffolds to improve hydrogen production in *E. coli* [155].

**Inducible association**

Small-molecule-induced association of proteins can be engineered by fusing the target proteins to interacting domains, for example, FRB and FKBP12 for rapamycin-dependent binding [134]. Photomodulation of protein/protein interactions is also possible: the PhyB/PIF3 (phytochrome) and Cry2/CIP1 (cryptochrome) pairs respectively exhibit red-light-dependent and blue-light-dependent association and have been fused to DNA binding and activation proteins to enable photo-activation of transcription in yeast [156–158] (Fig. 3b-ii); these systems could also be exploited in bacteria, for example, to accelerate split-intein-based reconstitution of transcription factors [156].

**DNA modification for memory**

Memory can be built into gene circuits using network motifs that generate robust bistability [159–161], but...
recent developments now allow direct editing of the organism's native data storage medium, DNA. Recombinases can be used to excise or flip a section of DNA, depending on the orientation of flanking recombination sites; incorporation of a control sequence such as a promoter or terminator gives a read-out of the orientation of the memory element, and memory elements can be concatenated or nested to create different two-input logic gates [29,162]. Genome mining was recently applied to identify 11 orthogonal phage integrases, which were all used in the creation of a memory array that can record 2048 (2^{11}) unique states, as well as for the assembly of three-layer cascades [163]. This expansion in the size of available permanent biological memory could be directly beneficial to environmental sensing systems [159] and should facilitate the construction of novel synthetic bio-computation architectures [163]. Bonnet et al. also incorporated an excisionase into their system to allow the orientation of memory elements to be re-set, creating re-writable memory [164].

Recombinase-based memory is limited by the small number of orthogonal recombinases, but Farzadfar and Lu have described scalable DNA-encoded memory that is encoded in an analogue fashion across a population of cells [25]. ssDNA is produced via reverse transcription of a retron, which is itself transcribed from an inducible promoter in response to the input being recorded (e.g., presence of drug). ssDNAs are designed to be mostly homologous to the target locus but introduce a desired mutation, and cells are engineered to express Beta recombinase to catalyse incorporation of the ssDNA at a replication fork (Fig. 3c). The introduced mutation can be designed to cause loss or gain of function in a gene, allowing the population to be screened and memory to be read. The number of recombination events is proportional to the number of ssDNAs produced, that is, the concentration of inducer, and memory can be re-written by expressing a different ssDNA to target the same locus.

Principles for Robust and Scalable Gene Circuit Design—Modularity and Orthogonality

Despite having a large and growing resource of components, an inability to accurately predict how they will function when combined means synthetic biologists have not succeeded in producing corresponding increases in gene circuit size [42]. Modularity is the quality of consistent function in a variety of contexts and is a core requirement for predictive design of complex gene circuits [8,15,165]. The complementary property of orthogonality implies that parts and modules will not display undesirable cross-talk with other elements in the engineered biological systems, as well as with the host genetic background. Orthogonal parts and modules are important for the compatibility of parts within, and scalable design of, large gene circuits comprising many components [44]. Ideally, synthetic biologists would like the components they use to be “plug and play”, functioning reproducibly in different circuit designs; in practice, the complexity of in vivo biological systems makes this very difficult to achieve. Unlike electronic digital circuits, the components in a biological circuit are not connected by insulated wires, and the flow of biological information has to depend on specific chemical interactions to avoid cross-talk. The interactions of gene circuit components with each other and with the host organism alter their function through unexpected contextual effects [14,15,166], including retroactivity—especially in larger circuits [137,165,167,168]. Here we introduce principles for building scalable gene circuits, discussing how context effects arise and how they can be mitigated, either through extensive characterisation of the gene circuit or through the insulation of components.

Physical composition

Undesirable contextual effects can occur through unanticipated interactions between the components of a gene circuit and between the gene circuit and the host environment [14,15].

Starting at the level of the physical assembly, parts can be sensitive to sequence changes at their boundaries [169–172]. From their analysis of 12,563 promoter/RBS combinations, Kosuri et al. found that nearly 17% of the variation in protein levels could not be predicted from the promoter or RBS strength [40]. A conceptual solution to the problems arising from physical composition is to expand the definition of a part to include the regions that influence its function. Informed by related work that identified the promoter:UTR and UTR:gene of interest (GOI) junctions as important sources of variability in gene expression [44,166] (Fig. 4a-i), Mutalik and co-workers created an expression operating unit (EOU) [17]. The EOU comprises a standardised promoter sequence and 5’ UTR sequence adjacent to the transcription start site to remove context effects on transcription initiation, whilst a leader peptide that is translationally coupled to the GOI removes secondary structure around the GOI's RBS (Fig. 4a-ii). Expression can be tuned by varying the –10 and –35 regions of the promoter and the RBS for the GOI (encoded within the leader peptide sequence) and by introducing rare codons into the leader peptide. Use of the EOU imparts a high level of consistency to relative expression levels of a GOI when varying promoter and RBS sequences, enabling highly predictive design and tuning of protein levels in a gene circuit. Further improvements might include standardisation of the length of the transcription control element to include the UP element [8,38].
Another approach to improve modularity is to insulate parts from their sequence contexts. At the DNA level, this might include adding standardised spacers between components [38] or preventing transcriptional read-through using transcription terminators. The high transcription rates of genes driven by T7 promoters are often a source of toxicity for the cell, making effective termination especially important in these cases [28,49]. There is the added benefit of producing defined mRNAs that possess a uniform 3' structure and have a more consistent range of stabilities. Chen et al. created a useful resource through the characterisation of 582 terminators of varying strength, including a subset of 39
that have better than 98% termination efficiency and have enough sequence variation to prevent homologous recombination [173]. Improvements in the modelling of terminators will aid predictive design of effective, compatible sequences [174].

Post-transcriptional processing can also be employed to insulate RNA-based parts from their transcriptional context. It is often desirable to arrange genes in polycistronic units to reduce the size of constructs and avoid re-using promoter sequences. Qi et al. showed not only how moving monocistronic protein coding genes into the context of an operon caused variation (i.e., variably decreased) in the production of the encoded proteins but also that this effect could be countered using post-transcriptional modification of the mRNA to create monocistronic units [16]. Target sequences for the P. aeruginosa Csy4 endoRNase were inserted to flank the RBS and open reading frame, removing 5′ and 3′ UTRs, resulting in consistent and often increased expression levels of the proteins; access for the ribosome to the RBS is standardised, and variable 3′ sequences that influence RNA stability are excised (Fig. 4b). Lou et al. demonstrated a similar approach using a ribozyme encoded in the transcript to cleave the 5′ UTR [30], whilst 3′ RNase III sites decreased expression variability in the study of Cambray et al. [174]. Transcript processing also allows more complex sRNA regulation to be employed by insulating cis-regulatory elements from interactions with each other so that multiple regulatory elements can be designed into one polycistronic transcript [88]—spacers are not effective insulators of RNA cis-elements [85].

**Functional composition**

When parts are connected to form a circuit, failure may occur because the output range of an upstream component does not match the required input range of the downstream one. Components that have been characterised in isolation are functionally connected in a gene circuit, and their interaction alters the behaviour of the upstream component because of increased load [165]. This effect has been termed retroactivity and can be illustrated with the example of a transcription factor that binds an operator site: whilst the expression level of the transcription factor may have been characterised when it is expressed in isolation, the connection of downstream operator sites reduces the levels of available protein due to sequestration [167,175]. Recent work has demonstrated that it is possible to mitigate retroactive effects on signalling dynamics caused by increasing downstream load through the use of an insulating kinase/phosphorylase buffer module that has faster kinetics than the transcription-based components [137,168]. Otherwise, retroactivity must be corrected for through characterisation of parts in their functional context followed by tuning of the circuit [44].

Undesirable cross-talk between components may also occur. This effect can be mitigated by using well-characterised part families that have been shown to be orthogonal [18,21,32,45,50]. RNA-based part families have the advantage that cross-talk can be effectively screened for in silico using thermodynamic models [20]. Orthogonality is a key quality for the creation of scalable part families, allowing larger circuits to be constructed and creating a wider variety of alternative components for use when tuning a circuit.

**Host context**

When a gene circuit is propagated within a host organism, it competes against native host processes for cellular resources and can interact directly with host components; these effects can disrupt the normal function of both the gene circuit and the host. Gene circuits use host machinery for activities including the replication of DNA, transcription and translation, and protein and RNA degradation, and they also draw energy and metabolites from host pathways. Cellular resource availability varies between growth conditions and host strains [176,177]. Cardinale et al. identified ribosome availability and growth rate as the key determinants for circuit performance across a range of E. coli strains, but they additionally found that specific deletions of host genes can also have a large effect [176]. These mutations indirectly effected circuit performance by altering flux through carbon and nitrogen metabolic pathways. The complementary approach of altering the host genetic (and metabolic) context through the enrichment of genes can also be beneficial for circuit behaviour [177].

If the burden of the gene circuit on the host exceeds homeostatic limits, the supply of resources needed for normal cell functioning and that of the gene circuit will be reduced, leading to altered behaviour or failure. For example, over-production of mRNA in E. coli causes competition for the translation machinery, leading to queuing that alters the dynamics of protein expression and upsets the correlation between mRNA and protein levels [178]. This overburdening can also cause a decrease in host protein production rates and inhibition of growth [179], effects that feed back on gene circuit function as altered expression levels and dilution rates. Similar effects occur if expression of heterologous proteins makes excessive use of rare codons, which can limit the overall rate of protein production due to a scarcity of charged tRNAs. Protein expression can be improved through codon optimisation [180], though the most optimal codon assignment may change depending on the state of the host [181]. Metabolic bottlenecks can also be purposefully utilised to exert control over global translation; Kobayashi [182] used a synthetic gfp gene (gene encoding green fluorescent protein) rich in rare
codons to suppress the global translation rate in *E. coli*, human cell lines, and adenovirus. As described previously for transcriptional control [78], this rare codon strategy might be combined with the use of UAAs: an open reading frame rich in re-purposed codons could be used as a general suppressor of genes that use those codons, or the total abundance of a set of synthetic proteins could be controlled through availability of the re-purposed tRNA. To prevent competition with the host for the transcription and translation machinery, the orthogonal alternatives of phage RNAPs [50] (possibly deployed within the previously described "resource allocator" framework [52]) and orthogonal ribosomes [118,119] can be employed. Further insulation from host processes might be possible in the future, by making use of reprogrammed or expanded genetic codes and UAAs [183,184].

Direct cross-talk between gene circuit and the host components can occur either through non-specific promiscuous interactions or through specific interactions that may cause interference [44] or toxicity [185]. Parts are often sourced from unrelated organisms in order to help avoid specific interaction between the circuit and host [44,136], and the genome can be screened for potential binding sites or interacting genes [19,21]—though these strategies cannot ensure that non-specific interactions do not occur. Non-specific interactions include off-target binding by protein/protein interaction domains [32] and transcriptional read-through [28]. The impact of part expression on the host growth rate and transcriptional profile can be quantified to aid selection of components that are orthogonal to the host [19,22,32]. Non-specific interactions are weaker than the desired specific interaction; thus, often toxic effects are only observed at high expression levels, leaving a reasonable functional range to work with [32].

**Beyond orthogonality and modularity: Managing context effects for robustness and genetic stability**

Robust gene circuits maintain their performance over time and across changing conditions—they respond adaptively to contextual perturbations such as host growth rate or transcription factor availability, and they often have a high signal-to-noise ratio, in order to produce consistent behaviour [186,187]. Gene circuits that function adaptively and do not over-burden their host are also more robust in terms of evolutionary stability [188]; as described previously, the burden imposed on a host by a gene circuit can reduce the growth rate, creating a selection pressure against that circuit. Gene circuits should be orthogonal to the host machinery wherever possible in order to reduce interactions with host processes and improve robustness. When interaction is unavoidable, the gene circuit can be designed to dynamically modulate its expression in response to increased strain on the host. An example of this is the negative feedback control of a biosynthetic pathway in response to elevated levels of a toxic intermediate [69], which improves the efficiency and productivity of the gene circuit, in addition to limiting the burden on the host. More complex regulatory networks might take inputs from a range of native promoters as a "fingerprint" to identify the metabolic state of the cell. In another example, Kushwaha *et al.* use integrated positive- and negative-feedback loops in their "portable expression resource" to tune the expression of T7 RNAP and maintain it at a non-toxic level in diverse Gram-positive and Gram-negative bacteria [189]. The study also shows the potential for engineering cross-species DNA parts, enabling the construction of genetic devices that function similarly across diverse organisms. Ceroni *et al.* recently used a "capacity monitor" to quantify the burden imparted by different gene circuit designs [190], concluding that the least burdened cells have more free ribosomes. This suggests that RNA-based circuits that perform analogue signal processing [11,191] are likely to be robust. The potential for evolutionary corruption of a gene circuit can also be reduced by not re-using parts, thus helping prevent recombination and choosing a host strain with reduced mutability [192].

**Characterisation across contexts**

It is clear that describing a part as modular also requires an understanding of the contextual limits of that modularity. Whilst insulation may preserve the properties of a component over a wider range of conditions, there will always be limits [193]. Beyond the contexts discussed above, wider environmental and ecosystem level effects—which can be controlled in the laboratory but are relevant to real-world applications—can interfere with circuit function and should be quantified [14,15]. The characterisation of parts under different conditions generates data that can be used to design an appropriate gene circuit for a given application [15].

As part libraries grow, the early calls for standardised descriptions of biological components become increasingly pertinent [194,195]. Common units such as polymerases per second and relative expression units facilitate comparison and exchange between engineers [9,39], and Mitalik *et al.* have outlined how the consistency of a component across contexts might be captured as a part "quality" statistic [166]. Olson *et al.* have produced an optogenetic system to drive gene expression for characterisation studies [196], whose rapidly reversible and easily tuned input allows interrogation of the dynamic response of a component [193]. These advances will hopefully improve our understanding of synthetic systems and accelerate progress towards their predictable design.
Tools for Debugging and Tuning Gene Circuits

Without fully predictive design capabilities, the construction of a gene circuit inevitably requires cycles of debugging and tuning; the causes of failure must be identified so that the design can be adjusted to make the circuit operate within desired parameters, either by replacing a non-functional (e.g., toxic or having an irreparable impedance mismatch) component or by selecting a variant with a more appropriate transfer function. Here we set out methods for identifying and correcting defects in gene circuits and fine-tuning their characteristics, and we discuss DNA assembly strategies in the context of the refinement process.

Debugging—Identifying causes of failure

The change in function that can result from connecting a biological component into a gene circuit might be easily observed or inferred, especially in small circuits where there are few elements connecting a controllable input and measurable output. In such cases, proceeding directly to tune and reassess the circuit behaviour might be a more efficient strategy than characterising the activity of the parts in their new context. In a large circuit, the number of connections between input and output may obscure which components are performing poorly. For this reason, a good general rule is to build and test modules of a larger circuit before combining them [44] in order to characterise parts in a context that more closely resembles that of the complete system. Stepwise addition of parts or modules to a circuit, with characterisation of the resulting network and comparison to previous iterations, enables quantification of the effects of elaborating the module composition [193].

This characterisation strategy requires methods to assess the levels of internal (i.e., non-output) gene circuit components. Quantification of the relevant biomolecules using, for example, RNAseq, produces a snapshot of the state of the circuit [40] and can also be used to assess the impact of the circuit on the expression of native genes [22]. In addition, synthetic biology tools in the form of sensors and reporters have been employed to investigate the state of gene circuit components. The activity of a promoter can be easily assessed by placing a reporter gene under its control; protein amounts [197] or localisation [198] can be monitored using a fusion to a reporter enzyme or scaffold [150], if the topology of the target protein permits. Similarly, RNA levels can be tracked in vivo through co-transcription with the Spinach aptamer [199], an RNA that activates fluorescence from its cognate fluorophore upon binding (a range of ligands with different spectral properties exist [199,200]). Recent work from the Jaffrey laboratory showed how Spinach can be adapted in a modular fashion into a combined sensor reporter of metabolites and proteins by altering a hairpin to contain a second aptamer [201]; binding of the target ligand allows the fluorophore binding pocket to form. Toehold switches can also be used to sense RNA levels [20], and in vitro studies that combine strand displacement sensing of RNA with the Spinach reporter show promise as future in vivo sensors that do not require an intermediate translation step [202,203]. Reporters and sensors can reveal the internal dynamics of gene circuits, but their introduction will perturb the gene circuit due to interactions with core components and the additional load on the host [193].

Tuneable elements in gene circuits

Once the cause of failure in a gene circuit has been identified, changes to the circuit must be made to correct its behaviour. Contextual interference might be resolved by changing the host chassis [44,176] or growth conditions. A component may have to be replaced due to toxic effects of its expression or because the required transfer function is outside of its dynamic range. If a component belongs to a large orthogonal set—for example, the TetR transcriptional regulators [21] or the IS10-based translational regulators [18]—then it may be possible to select an alternative that has a more appropriate transfer function. Signal amplifiers also can be introduced into the gene circuit to correct for impedance mismatch by modulating the output of an upstream component to harmonise the connection [45,162,204]. Otherwise, the behaviour of a gene circuit is typically corrected by making appropriate adjustments to promoter or RBS strength, component degradation rate, or copy number.

RBSSs and promoters are well suited as tuning knobs for a gene circuit [44,205], as their (relative) activity can be computationally modelled reasonably well [31,117]; thus, the selection of variants is not limited to a characterised library. In addition, they are short sequences that have a large influence on the transfer function of a component, so a wide range of activities can be sampled by using degenerate oligonucleotides to construct or mutating these parts [115]. For example, the T7 promoter sequence is approximately 23 base pairs long, with distinct subsequences responsible for initiation and specificity [169] that have made it amenable to mutagenesis and screening for variants with a range of promoter strengths [206,207]. The interacting regions of trans- and cis-acting RNAs share the same qualities of predictable design and relative short length and thus could be useful as tuning devices.

The number of copies of a DNA sequence can be adjusted either through adding duplicates to the design of the circuit (e.g., doubling up transcriptional attenuators [85]) or by transferring the component to a plasmid
with a different copy number [208]. Control over the levels of DNA components can be used to tune transfer functions: increasing the copy number of a gene will increase the output mRNA level [208]; increasing the number of operator sites can improve cooperativity through regulator sequestration [209].

The degradation rate of components is an important parameter in dynamic circuits, such as repressilators, which require rapid degradation of regulators to remain in the oscillating parameter space [210]. Tools for controlling protein degradation rate were described above [132,134,136]; tools for controlling RNA degradation rates are less sophisticated, but we anticipate that the growth of RNA-based gene circuits will stimulate progress in this area.

**Strategies for circuit refinement**

When refining the behaviour of a gene circuit, the extent to which synthetic biologists should rely on rational design informed by characterisation, or directed evolution, is a matter of debate [211]. In practice, our current inability to accurately predict component function means that efficient tuning strategies will probably involve some screening of variants [7,212]. Whilst modern combinatorial assembly methods are powerful [40], there are limits to the size of variant libraries that can be effectively sampled in a screen [114]. Characterisation and subsequent modelling [44,107,196,213] of circuits can be used to inform the creation of variants, in order to efficiently search a circuit’s parameter space for a desired behaviour [115]. Variation might also be included in the first iteration of circuit building, if potential points of failure can be identified in advance. The recent construction of a half-adder logic circuit in *E. coli* made use of both of these strategies, using the results from tests of lower-level circuits plus *a priori* knowledge of possible context-dependency-based “bugs”, to create a focused selection of variant designs during the next stage of circuit development [214]. The requirement for tuning and debugging gene circuits is an assembly strategy for construction of a gene circuit [215].

The widely used BioBrick standard [9,216,217] (and related variants [218,219]) uses type II restriction enzymes for the stepwise idempotent construction of units that have standard prefix and suffix linkers. Whilst the introduction of variation to tuning elements is easy during the initial assembly, once a part has been subsumed into a larger module, it cannot be exchanged; the workflow must return to the step where that part was added if alterations need to be made, or alternative (e.g., PCR-based) methods of introducing variation must be used. This cumbersome limitation is not found in the recently described BASIC method, which uses type IIS restriction enzymes to create overhangs for the attachment of linker fragments to defined parts, facilitating parallel assembly of up to seven components [220]. A similar method using isothermal assembly is available, but the linkers are defined when parts are initially cloned, again making it more difficult to change the order of parts [221].

Bespoke, PCR-based assembly methods such as SLIC [222], Gibson Assembly [223], CPEC [224], and SLiCE [225] are alternatives to linker-based assembly, and they avoid the formation of “scars” that can influence circuit function [226]. A large range of variation can easily be introduced to several positions in parallel using degenerate oligonucleotides [107], whereas modular assembly strategies might be limited by the characterised parts available. Construction is not always sequence independent, however, as secondary structure and repeated sequences in the overlaps can prevent correct annealing. Additionally, the requirement for generating parts by PCR (and subsequent sequence validation) for every construct may not be suitable for some workflows [220].

MAGE is a powerful tool for introducing post-assembly variation into a gene circuit [114,227]. ssDNA oligonucleotides are incorporated into replicating DNA via λ-Red recombination. Repeated rounds of MAGE with a mixture of oligonucleotides targeting different loci and/or with degenerate sequences [115] can be used to incrementally saturate the population with mutations.

**Concluding Remarks and Outlook**

After nearly one and a half decades of accelerating growth, synthetic biology has now advanced to a stage where there are many tools and building blocks available for gene circuit engineering. Significant progress has also been made to improve the modularity and orthogonality of these building blocks to enable more predictable and robust design of large complex gene networks. Using the state-of-the-art tools and principles described here, the scale, complexity, and resulting functionality of next-generation synthetic gene circuits will be significantly greater than their current counterparts, thus enabling many new applications and driving a revolution in industrial biotechnology.

RNA-based parts are likely to majorly drive the next increases in gene circuit sophistication due to their ease of programmability and because the thermodynamic models that facilitate their design can be adapted to predict behaviour at the circuit scale [228,229]. CRISPR-dCas9 and toehold switches are prime examples, exhibiting large dynamic ranges and specific interactions with targets. In addition, standardised expression cassettes will aid predictive design and tuning of protein components. The deployment of these tools in the near future should provide useful insights into their potential limitations (e.g., toxicity
and best practice for their implementation. Likewise, detailed characterisation of the larger circuits that we anticipate being built in the coming years will inform our understanding of context effects and retroactivity, enabling engineers to hone design principles for improving robustness. Though the dynamic and undefined environment of the host can cause unexpected variation in gene circuit behaviour, strategies that combine the use of insulated parts and rational, model-driven searching of parameter space will reduce the time required to build large circuits. Variation due to interactions with the host metabolism might be further reduced by using strains with reduced genomes [192].

That said, further development of components is needed, especially in particular areas. For example, modular sensors of small molecules with new bespoke binding specificities will be required to connect synthetic control circuits with metabolic pathways [68]. Similarly, new orthogonal quorum-sensing mechanisms [230] would expand the opportunities for intercellular communication in synthetic microbial communities [231], enabling the development of more sophisticated distributed biological computing [232]. The ease of screening for aptamers puts the development of RNA-based sensors at the fore for now, though the potential for stronger interactions with a wider range of ligands means rationally engineered proteins will probably be better components in the future [233]. Work is needed to standardise and refine the process of linking RNA aptamers with regulatory regions, to produce components that possess high specificity and large dynamic ranges.

There are also opportunities to expand and improve existing classes of regulators: for example, the mechanism of STAR transcriptional regulation by direct disruption of a terminator hairpin [22] is very similar to the mechanism of toehold switch transcriptional regulation [20], suggesting that the number of orthogonal STARs might be equally amenable to scale up through the rational design of new STAR-terminator pairs [173]. DNA-based memory will potentially enable biological circuits that can learn from past experience and adapt accordingly, but the slow rates of DNA modification make population-wide digital recording of transient signals difficult [25,164]. Two-tier memory systems may prove valuable, using bistable circuits with fast switching dynamics to stabilise a signal until complete DNA modification has occurred.

Recent advances in part provision and quality will need to be matched by development of circuit design capabilities if significant gains in complexity are to be realised. Computational tools for the selection and optimisation of network topology and constituent parts will be essential for the design of large synthetic networks [234–236]. Digital signal processing is required for certain applications [237] but is energetically expensive and therefore difficult to scale up [238]. A shift towards analogue signal processing will be required to create synthetic circuits that have the sophistication and efficiency of natural systems [11,238]. For the next generation of designer microbes to function robustly outside of the laboratory, circuit design will need to incorporate higher-level management of functional subsystems [239] to provide the adaptability necessary for real-world applications.

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Abbreviations used:
RBS, ribosome binding site; RNAP, RNA polymerase; sRNA, small RNA; UTR, untranslated region; UAA, unnatural amino acid; ssDNA, single-stranded DNA; taRNA, trans-acting RNA; GOI, gene of interest; TALE, transcription activator-like effector; CRISPR, clustered regularly interspaced short palindromic repeat; STAR, small transcription activating RNA; PAM, protospacer-adjacent motif; MAGE, multiplex automated genome engineering; EOU, expression operating unit.

References


Review: Microbial Gene Circuit Engineering


