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# Using synthetic biology to study gene regulatory evolution Justin Crocker<sup>1</sup> and Garth R IIsley<sup>2</sup>



Transcriptional enhancers specify the precise time, level, and location of gene expression. Disentangling and characterizing the components of enhancer activity in multicellular eukaryotic development has proven challenging because enhancers contain activator and repressor binding sites for multiple factors that each exert nuanced, context-dependent control of enhancer activity. Recent advances in synthetic biology provide an almost unlimited ability to create and modify regulatory elements and networks, offering unprecedented power to study gene regulation. Here we review several studies demonstrating the utility of synthetic biology for studying enhancer function during development and evolution. These studies clearly show that synthetic biology can provide a way to reverse-engineer and reengineer transcriptional regulation in animal genomes with enormous potential for understanding evolution.

#### Addresses

<sup>1</sup>European Molecular Biology Laboratory, D-69117 Heidelberg, Germany

<sup>2</sup> Okinawa Institute of Science and Technology Graduate University, Onna, Okinawa 904-0495, Japan

Corresponding author: Crocker, Justin (justin.crocker@embl.de)

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## What determines patterns of gene expression in space and time?

Morphological evolution often involves many mutations of small effect at the single nucleotide substitution level — not just one mutation of large effect [1] consistent with Charles Darwin's favored view of a gradual evolutionary process. However, assaying changes of small effect is a challenge. In the words of the population geneticist John Gillespie regarding protein evolution: 'Perhaps we are investigating phenomena that are below the resolving power of our current techniques: phenomena large enough to dominate genetic drift, yet refractory to direct experimental investigations' [2]. This observation is no less relevant when applied to the regulatory regions of the genome, the transcriptional enhancers, that specify the precise time, level, and location of gene expression. Enhancers contain activator and repressor binding sites for multiple transcription factors and each transcription factor exerts a nuanced, contextdependent effect on enhancer activity [3-8]. Recent findings have shown that the output of the enhancer the expression of the associated gene - can be adjusted gradually by modifying the transcription factors or their binding sites [5<sup>••</sup>,9<sup>••</sup>,10] and that individual transcription factor binding sites are often low-affinity [4,11,12<sup>••</sup>], with limited individual effect on gene expression when altered [4].

However, despite decades of research, a general and quantitative understanding of enhancer function has eluded discovery [7,8]. An example of this is the enhancer that drives expression of the second stripe of the gene *evenskipped (eveS2)*. Mechanisms for the precise regulation of *eveS2* have been explored by a range of methods including biochemistry, genetics, evolutionary genetics, live imaging, and computational modelling [13–19]. However, attempts to recreate a functional *eveS2* by building 'synthetic' enhancers with known binding sites have led to inconclusive results [20] (Figure 1) — indicating that we lack an understanding of the necessary components for enhancer function, and how these components function collectively.

Recently, there has been a rapid increase in synthetic biology with a focus on the construction of designed genetic systems. Synthetic biology is 'alternative chemistries, artificial cells, self-replicating macromolecules, *im silico* life forms, genetic circuits' [21]. Much of this work is focused on industrial applications, such as the construction of drug precursors [22], information storage [23], or diagnostics devices [24]. In this review, we explore how synthetic biology provides a powerful toolset to understand gene regulation and evolution, allowing biologists to construct tractable systems to test models *in vivo*.

## Large-scale mutagenesis of developmental enhancers

A challenge in studying regulatory elements is explaining *why* natural architectures have evolved to be in their current state. For example, it took enormous effort to decipher the evolved regulatory changes in a robust enhancer of the *shavenbaby* gene; to discover that gain



Figure 1

Synthetic *eveS2* enhancers do not drive appreciable expression in embryos. (a) Schematic of the *even-skipped* locus, indicating early embryonic *cis*-regulatory stripe enhancers in grey boxes, and the eveS2 minimal enhancer, indicating binding sites for known TFs. (b) Different types of synthetic variants of the eveS2 element with either scrambled motifs, variant 1–4, or fixed motif distances with scrambled intervening sequences (dotted line). (c)–(h) Stage 5 embryos stained for  $\beta$ -Gal RNA carrying the indicated enhancers. In no cases do any of the synthetic enhances drive expression comparable to the wild-type enhancer (c). See also Vincent *et al.* [20].

of a repressor binding site overcame robustness encoded by multiple activator binding sites [25]. Such a lack of clarity is because, at present, we have a limited understanding of how natural genetic variants influence any given enhancer. Synthetic saturation mutagenesis provides a powerful means to assay the transcriptional activities of thousands of regulatory elements in a single experiment — providing an *in vivo* assay of mutation effects. The principle of this technology was first applied towards high-resolution analysis of bacteriophage and mammalian promoters by

synthetic saturation mutagenesis *in vitro*, assaying all possible point mutations and small insertions/deletions of these promoters in parallel [26]. Similar assays have been used to dissect a number of promoters and enhancers [27–30]. Together, the results of these studies suggest that individual mutations often have modest effects on enhancer activity. Furthermore, low-affinity, non-canonical motifs [4,31] play a part, emphasizing the importance of more fine-grained experimental characterization.

Application of synthetic saturation mutagenesis to developmental systems will uncover what mutations augment the timing, level, or location of gene expression. However, to date most of these high-throughput assays rely on transient expression using episomal vectors. These assays were performed in the absence of native chromatin context and they are limited to cell types responsive to transfection. Recent experiments have used a lentiviral-based method in mammalian cells, allowing assays in a more biologically relevant context [32<sup>•</sup>]. In the future, 'lab on a chip' experiments [33,34] will facilitate such high-throughput methodology to be applied to classic model systems using stable transgenic constructs, providing a comprehensive understanding of enhancer function in a chromatin context during animal development.

The construction of synthetic versions of natural enhancers allows defined samples of variants to be examined, whether targeted or uniform. Importantly, such an approach to studying regulatory variation allows both the examination of 'evolutionarily relevant mutations' [35], those found at appreciable frequency in natural populations, as well as those that are rare and/or deleterious. For example, in a Saccharomyces cerevisiae study, the effects of polymorphism segregating in the TDH3 promoter among 85 strains were compared to 235 defined, synthetic mutations in the same promoter [36<sup>••</sup>], demonstrating that selection on gene expression noise has a greater effect on sequence variation than selection on mean expression level. This fits well with results from engineered circuits in B. subtilis, which revealed that 'noisy' circuits provide broad physiological response ranges [37], demonstrating the utility of synthetic approaches. We anticipate that such research will be central to identifying and classifying the individual mutations responsible for variation.

## Designed synthetic enhancers and high-throughput screens

Complex libraries of designed synthetic regulatory elements can be used to explore enhancer structure and its effect on activity [38]. Using synthetic enhancers containing different patterns of twelve liver-specific transcription factor binding sites, Smith *et al.*, suggest that there is flexibility in binding site order [39], and that heterotypic enhancers, composed of different binding site motifs, are expressed more highly than their homotypic analogs. By contrast, in yeast, a library of 6500 synthesized sequences was analyzed, and it was found that transcription factor binding site number, location, and affinity were important for the activity. In Drosophila, Erceg and colleagues engineered 63 synthetic enhancers to assess the relationship between variation in the content and spacing of motifs within enhancers [40]. In over half the cases, elements containing only one or two types of transcription factor binding motifs were capable of driving specific patterns during development. Different motif organizations provided different degrees of robustness to enhancer activity, ranging from binary ON/OFF responses to subtle effects in levels and probabilities of expression. Similarly, a high-throughput screen in Ciona embryos identified synthetic notochord enhancers that are activated by a combination of two transcription factors [41]. Manipulation of these enhancers elucidated a 'regulatory code' for notochord-specific expression, whereby the optimal spacing of motifs compensates for low-affinity binding sites. Grossman and colleagues used a synthetic biology approach, paired with in vivo binding assays, to systematically dissect the contribution of genomic regulatory elements with PPAR $\gamma$  motifs [42<sup>•</sup>]. They found that different pairs of motifs followed different interaction rules, whether additive, subadditive or superadditive, with some pairs spatially constrained and others having more flexibility.

#### Interpreting synthetic enhancer results

Layers of control and exceptions to the rule are typical in biology, but it remains an open question as to whether enhancers are built with a flexible architecture that can evolve and change easily or whether complex organization is intrinsic to their function [43].

Regulatory control in developmental biology has usually been explored using genetic tests, reporter assays or studies of DNA binding [44] where the experimental results are by design typically binary, revealing regulatory links that turn expression ON or OFF depending on the context. These results can be combined into complex regulatory networks [45], which have value in summarizing and interpreting discrete experimental data. However, without context the resulting formalism can encourage the view that gene regulation is brittle and that it evolves in steps. By contrast, construction of synthetic regulatory platforms is a powerful alternative to test models of enhancer function, with results that are more fine-grained and quantitative, hence requiring an alternative modelling approach. Various models of gene expression are available [46–50], but they are often complex with many parameters [48,51,52]. This range of choice does not help address a fundamental problem, which is that explaining enhancer function without reference to a suitable null hypothesis leads to an acceptance of models that are more complex than necessary and interpretations



Figure 2

Synthetic enhancer results evaluated against a null model assuming flexible enhancer architecture with collaborative TF binding, represented by a logistic model. (a) Different types of synthetic enhancer variants of a base enhancer can be evaluated using the null model, from top to bottom: deleting binding sites, modifying a site to target a specific TF or engineering a TF to target a novel site. (b) TF context under the null hypothesis. A new TF (orange) is engineered to replace the existing TF binding sites of a native enhancer (green and purple). The relative strengths of the different TFs are shown in the bar chart. The logistic model predicts that the orange TF will reduce expression when targeting the first site and will increase expression at the second site, thus showing that context-dependent activity can arise without localized cooperativity or enhancer structure. (c) Synergy under the null hypothesis. TF2 (purple) binds and activates more strongly than TF1 (green). Assuming no physical cooperativity, TF1 has little effect on its own, TF2 can increase expression, but both are required for full expression, demonstrating synergy. (d) Heterotypic binding sites can produce stronger expression than homotypic binding under the null hypothesis. Synthetic enhancer constructs can be categorized by level of complexity depending on how many TFs bind (left). If the TFs have different strengths of binding and activity (center), it is possible for heterotypic binding to produce stronger expression on average (right) under the null hypothesis, without requiring any special cooperativity or enhancer grammar.

that overstate the case of exceptions and enhancer complexity. This is illustrated with a few examples (Figure 2) using arguably the simplest predictive model as the null hypothesis, the logistic model. The base logistic model assumes independent binding of transcription factors, or perhaps more accurately, collaborative binding, where binding is dependent on cooperativity with all factors and the promoter, rather than with specific neighbors [53,54,55<sup>••</sup>]. Collaborative binding has important evolutionary implications in that transcription factor binding sites can be lost or gained gradually. In other words, enhancer structure is not brittle. Yet, despite this simplicity, the associated model explains how a transcription factor targeted to different sites can act to increase or decrease expression depending on context (Figure 2b) and that synergistic effects can result from collaborative binding and do not require pairwise interactions between transcription factors (Figure 2c).

A further example is synthetic enhancers with heterotypic binding sites producing stronger expression on average than those with homotypic binding sites, which can be taken as evidence that increased binding complexity leads to stronger expression [39]. However, this result is also compatible with the null hypothesis of flexible architecture — if transcription factors have suitably different strengths (Figure 2d).

That said, the purpose of these observations is not to rule out the importance of pairwise cooperativity or enhancer grammar in specific contexts, but rather to show the value of the logistic model as an appropriate null hypothesis for interpreting synthetic enhancer results.

### Testing models of synthetic enhancer activity

To test models of enhancer activity in a developmental context, we have employed engineered transcriptionactivator-like proteins (TALEs) fused to activators or repressors [56] (Figure 3), TALEAs and TALERs,





Logistic model predicts the quantitative control of the *rhomboid (rho)* enhancer. **(a, c, e)** Stage 5 embryos stained for  $\beta$ -Gal RNA carrying the indicated TALE-*VP64* activator (TALEA) or TALE-*hairy* repressor (TALER) constructs and *rhomboid* enhancers. Adapted from Crocker *et al.* [5<sup>••</sup>]. **(b, d, f)** Profiles of average expression levels for the embryonic genotypes shown in panels (a, c, e) (*n* = 10 for each genotype). In all plots, the dashed black line denotes the wild-type embryo predictions, with red TALER-*hairy* or TALEA-*VP64* predictions, respectively. Shaded areas indicate one standard deviation of experimental embryonic data. AU indicates Arbitrary Units of fluorescence intensity. The model predicts increased expression in the dorsal and ventral regions with the addition of TALEAs (blue dashed lines).

respectively, to target novel transcription factor activity to enhancers [5<sup>••</sup>]. We employed 'sequence-free' models, which abstract enhancers as simple machines that measure transcriptional activation and repression as inputs, and produce transcriptional outputs as mathematical functions [47,57-61]. Regulatory input was found to combine linearly with existing inputs and a sequencefree approach accurately modelled each enhancer's transcriptional output, providing a method to quantitatively control enhancers in vivo. That enhancers can function as simple input/output devices, where similar transcription factors can substitute for each other is supported by Stampfel and colleagues, who explored the regulatory contributions of transcription factors and cofactors in various combinations by recruiting GAL4 DNA-bindingdomain fusions of many Drosophila transcription factors and cofactors to different enhancers [62<sup>•</sup>]. Similarly, Khalil and colleagues used artificial zinc-finger transcription factors to create synthetic transcription factors and used these to wire synthetic transcriptional circuits in yeast [63]. They engineered tunable transcriptional outputs by adjusting key properties; including specificity, affinity, syntax, and protein–protein interactions. In *Drosophila*, a well-defined set of transcriptional modules was used to test a fractional occupancy-based model, which explained the effect of repressors on endogenous activators [50]. Thus, construction of synthetic regulatory platforms is a powerful way to test simple models of enhancer function.

Together, these results have broad evolutionary implications as the activities of individual, and cooperative pairs of transcription factor binding sites are combined in a linear manner to produce a sigmoidal output. Combined with the wide spectrum of individual binding sites that can be bound by individual transcription factors [4,64–66], this means that the same enhancer activity can be encoded by a vast number of different sequences. This is consistent with a large body of data demonstrating the rapid evolution, and variable architectures, of transcriptional enhancers with conserved functions [19,53,60,67–72].

## Building synthetic transcriptional regulatory networks

Transcriptional networks contain the information required to confer robust positional information within a developing embryo. However, these networks have remained recalcitrant to modelling, as every parameter, such as diffusion and binding coefficients, are usually fitted values, and not derived from *in vivo* data. Fully synthetic networks allow the exploration of network architecture with fewer unknowns. In mammalian cell-



A fully synthetic transcriptional platform in *Drosophila* consisting of engineered transcription factor gradients and artificial enhancers. (a) Schematic representation of the approach used to build a TALEA gradient using the *hunchback* (*hb*) promoter (adapted from [9<sup>••</sup>]). (b) Schematic of synthetic enhancers built to detect the TALEA gradient. (c) Stage 5 embryos stained for *lacZ* expression from synthetic enhancers with the indicated number of Zelda binding sites (adapted from [9<sup>••</sup>]). The number of Zelda motifs changes the probability of being ON or OFF – or the 'state' of expression. (d) Stage 5 embryos stained for *lacZ* expression patterns of opposing TALEA and TALEA gradients. (f) Schematic of synthetic enhancers used to test the effect of tandem versus overlapping activator and repressor binding sites. TF occupancy models of embryos with the indicated TALEA and TALER arrangement accurately predict that binding site arrangement provides precision to enhancer expression; see also Crocker *et al.* 2017 [9<sup>••</sup>].

#### Figure 4

systems there is an expanding number of studies exploring synthetic gene circuits [73]. Many synthetic networks have focused on unique functions of a particular circuit, for example complex dynamics [74–77] or information processing [78–85]. Other efforts use gene circuits that interface with endogenous inputs from the cell or environment to drive a desired response [24,86°,87].

This framework can be applied to test general principles of development [88]. For example, Crocker and colleagues constructed a simple synthetic enhancer platform in Drosophila embryos that responds to an engineered morphogen gradient (Figure 4) [9<sup>••</sup>]. They observed that while levels of expression are controlled by activator binding site number, the ON or OFF 'state' of enhancer activity was controlled by the number of Zelda binding sites — a so-called 'pioneer factor'. Furthermore, they show how overlapping binding sites can create welldefined expression boundaries during development. Similarly, Bintu et al. monitored a transcriptional reporter gene carried on a synthetic human chromosome and found that gene silencing was all-or-none, and that the duration of recruitment of the chromatin regulators determined the fraction of cells that were silenced [89]. Thus, distinct epigenetic modifiers can produce different types of repression and epigenetic memory. The use of 'epigenome editing' [90-93], combined with synthetic enhancer platforms will allow deeper investigation into how different protein domains contribute to enhancer activity than is possible using native enhancers.

It is possible to extend these systems to build more sophisticated synthetic regulatory systems that could be engineered to test the roles of specific features of regulatory architecture during development. Such networks could be used to test directly the roles of canonical 'network motifs' during development [94], such as the role of feed-forward loops, biological noise, oscillations, systems drift, and developmental precision [11,93,95–97]. Synthetic networks could incorperate highly modular construction [98,99], synthetic receptors [100,101] and engineered cell-contractility [102] for the transduction of transcriptional inputs into diverse outputs, providing tests of models for transcription and development [103–106].

Adaptive evolution in animals is a complex optimization process that is highly combinatorial [107]. This complexity is due in part because selection acts over multiple developmental scales — cells, fields of cells, tissues, organs across different gene regulatory networks, and across different developmental stages [108]. Therefore, it can be difficult to infer past selection events from genomic data. For example, comparative studies of distantly related species and genetic analysis of closely related species indicate that many equivalent characters between taxa differ in their gene regulatory networks, either due to convergent evolution or as a result of developmental system drift [109–111]. Additionally, we know little about the 'ruggedness' of biological fitness landscapes [112], yet the architecture of regulatory networks may dramatically shape evolutionary trajectories [109]. Understanding how networks evolve requires knowledge of the molecular components, their actions, and the dynamics of these interactions.

The ability to build synthetic networks in developmental systems allows the exploration of network architecture with fewer unknowns. Thus, like synthetic enhancer platforms [9<sup>••</sup>], the construction of synthetic regulatory networks will be a powerful way to test simple models of network function. Such systems will provide many variants, each of which can be clearly defined, freeing evolutionary biologists from both the limited biological data that may exist in natural populations as well as the complexities inherent in densely connected networks [113,114]. The dissection of composite traits into much smaller, discrete problems has proven to be a very successful research program [1,25,115], even though most 'traits' of current evolutionary interest are composites of multiple developmental problems [35]. Understanding how variation in network structure relates to variations in traits will clarify the extent and importance of network modularity in evolution. We anticipate that synthetic networks will provide direct and tractable tests of how gene regulatory networks function, providing new material for the study of variation [116].

### Conclusion

The goal of developmental biology is to understand how a single cell develops into a multicellular animal. This complex process requires that cells divide, differentiate, and form precise patterns. Over the past century, we have learned an enormous amount about this process deciphering the molecules and pathways essential for animal development. Although we have identified many of the constitutive components of development, understanding how networks of these molecules interact to build multicellular animals has proven challenging. Developmental biology can now exploit genome engineering technologies, high-throughput robotics, liveimaging, and single-molecule imaging techniques in live embryos [56,117–120]. Such assays will allow us to measure the number of transcription factor molecules in cells, molecular interactions in vivo, and the rates of transcription and translation of genes. Along with these experimental goals, improved models that simplify and abstract aspects of the system will help provide an intuitive understanding of its operation. Together, synthetic biology will allow deeper investigation into the process of development creating a cross-cutting approach to study gene regulatory evolution.

### **Conflict of interest statement**

Nothing declared.

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