

Pattern formation by dynamically interacting network motifs

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Systematic validation of pattern formation mechanisms revealed by molecular studies of development is essentially impossible without mathematical models. Models can provide a compact summary of a large number of experiments that led to mechanism formulation and guide future studies of pattern formation. Here, we realize this program by analyzing a mathematical model of epithelial patterning by the highly conserved EGFR and BMP signaling pathways in *Drosophila* oogenesis. The model accounts for the dynamic interaction of the feedforward and feedback network motifs that control the expression of Broad, a zinc finger transcription factor expressed in the cells that form the upper part of the respiratory eggshell appendages. Based on the combination of computational analysis and genetic experiments, we show that the model accounts for the key features of wild-type pattern formation, correctly predicts patterning defects in multiple mutants, and guides the identification of additional regulatory links in a complex pattern formation mechanism.

computational modeling | *Drosophila* | signaling | systems biology

During *Drosophila* oogenesis, the 2-dimensional follicular epithelium that envelops the growing oocyte gives rise to an elaborate 3-dimensional eggshell (Fig. 1*A* and *B*) (1). The formation of the respiratory eggshell appendages depends on the formation of the characteristic two-domain gene expression patterns in the follicular epithelium (Fig. 1*D*). One of the key regulators in this process is *broad* (*br*), a gene that encodes a transcription factor expressed in the cells forming the roof (upper part) of the future dorsal appendages (2–5). We have recently proposed a mechanism whereby the spatiotemporal pattern of *br* is governed by the sequential action of feedforward and feedback loops induced by the highly conserved epidermal growth factor receptor (EGFR) and bone morphogenetic protein (BMP) signaling pathways (Fig. 1*C*) (6).

According to this mechanism, the EGFR ligand *gurken* (GRK), secreted from the dorsal anterior cortex of the oocyte, establishes the dorsoventral gradient of EGFR activation that induces *br* in the dorsal follicle cells (6–8). In the anterior dorsal midline, which corresponds to the highest level of EGFR activation, this gradient induces a localized repressor, most likely pointed (PNT), that counteracts the induction of *br* (8–10). In the anterior follicle cells, *br* is also repressed by signaling induced by DPP, a *Drosophila* BMP2/4-like ligand. DPP is secreted from the anteriorly located stretch and centripetally migrating follicle cells and acts through the uniformly expressed DPP receptors, establishing an anteroposterior gradient of DPP signaling (11–13). Thus, the EGFR and DPP pathways localize *br* expression to the 2 dorsolateral domains of the follicle cells (Fig. 1*D*). At later stages of oogenesis, BR controls the expression of *thickveins* (*tkv*), which encodes a type I DPP receptor essential for DPP signaling (6). Because DPP represses *br*, this initiates a negative feedback whereby BR controls its own transcriptional repression (6). Another layer of *br* regulation is provided by *brinker* (BRK), a transcriptional repressor of DPP signaling (14, 15) that is induced by EGFR and repressed by DPP in oogenesis (16, 17). BRK is likely to delay the repressive action of DPP in the roof cells until a sufficiently high level of BR is established.

Rigorous validation of patterning mechanisms at this level of complexity is essentially impossible without modeling approaches that can test the consistency of the proposed regulatory networks

and suggest new experiments. One of the main goals for models is to predict the dynamic expression of multiple network components in multiple genetic backgrounds. With this in mind, we present here a mechanistic model of *br* regulation. We demonstrate that the model can successfully predict the dynamics of the network in the wild-type and mutant backgrounds. At the same time, we identify a number of inconsistencies between predicted and experimentally observed patterns and suggest changes in the mechanism that can explain them.

Results

Model Formulation. The spatial arrangement of the midline, roof, and lateral cell fates in the follicular epithelium can be described using a 1-dimensional model, where the spatial coordinate measures the distance along a straight line that is drawn at an angle from the dorsal midline of the follicular epithelium (Fig. 2*A*). This line captures patterning along both the anterior–posterior as well as the dorsal–ventral axes. Although it misses subtle pattern variations in the midline domain, it allows us to accurately describe the expression patterns in the BR (roof) domain. In the model, local regulation modules that describe the cell-autonomous parts of the network, such as signaling and gene regulation, are coupled by the previously described reaction–diffusion modules that explain the gradients of EGFR and DPP activation (8, 11). We use switch-like models of gene regulation, where the dynamics of gene expression are governed by a piecewise-constant production function and a linear decay term (18–20). The use of such models is justified by the sharp expression boundaries for a large number of genes expressed in the follicular epithelium (21).

Our model analyzes the regulatory interactions shown in Fig. 1*C* (experimental evidence for each of these interactions is presented in Table S1). Briefly, the model accounts for the spatial distribution of the GRK and DPP ligands and, consequently, EGFR and DPP signaling, and their effects on the expression of 4 genes: *pnt*, *brk*, *tkv*, and *br*. The GRK and DPP portions of the model are based on the previously published biophysical descriptions of these morphogens (8, 11). With the exception of *br*, we lump the transcript and the protein into one species characterized by a single time scale that is equal to the inverse of the degradation rate constant (k_d in Eq. 3). Because it is known that the lifetime of BR protein is longer than that of the *br* transcript, *br* and BR are modeled separately, with the rate of BR production assumed to be linearly dependent in the level of *br* transcript.

We assume that the levels of both GRK and DPP signaling, [S_{EGFR}] and [S_{Dpp}], are proportional to the occupancy of their

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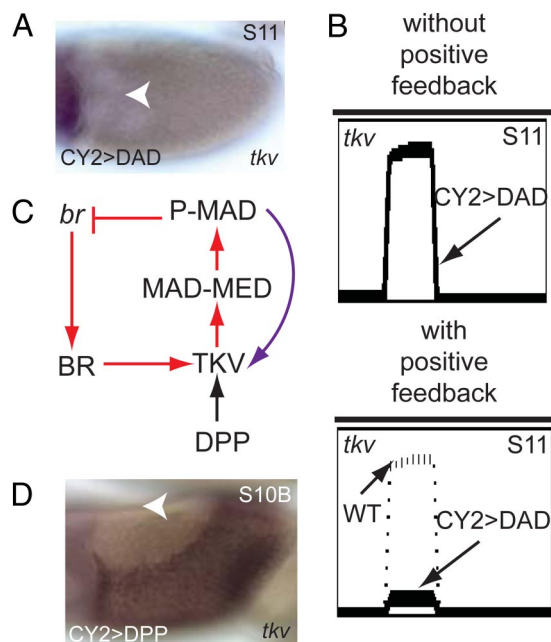


Fig. 4. Positive feedback loop suggested by the model. (A) In situ hybridization of *tkv* in CY2-DAD background shows that *tkv* expression is greatly reduced. (B) Simulations without the positive feedback loop predict that *tkv* expression in this background is indistinguishable from its wild-type expression pattern (Upper). When the positive feedback loop is included, however, simulations predict that *tkv* expression is greatly reduced in CY2-DAD egg chambers (Lower). (C) A positive feedback loop involving DPP signaling regulating the expression of its own receptor TKV is added (purple arrow) into the network presented in Fig. 1C. Here, only part of the network is shown. (D) In situ hybridization image of *tkv* in a CY2-DPP egg chamber. A shows dorsal view and D shows lateral view with dorsal on top; anterior to the left. Arrowheads mark the dorsal midline. (Original magnification, 20 \times .)

oogenesis (Fig. 1D). The wild-type pattern of P-MAD looks like the 2 laterally placed “eyebrows” and can be interpreted in terms of a model where an anteriorly secreted ligand diffuses across the follicular epithelium with a spatially nonuniform (2-domain) pattern of TKV (6, 28). We found that P-MAD is cell-autonomously lost in the GFP-marked *brk*⁻ clones, in agreement with our computational prediction (Fig. 3D). Thus, according to our computational results, BRK has a dual role in oogenesis. First, it counteracts the repressive effect of DPP signaling, just as it does in other stages of development (14, 29, 30). This earlier effect has an “echo” at later stages of oogenesis, when BR, protected from DPP signaling by BRK, begins to control TKV expression and, as a consequence, the spatial distribution of DPP ligand and the spatial pattern of DPP signaling (Fig. 1C).

Positive Feedback Loop Suggested by the Model. In analyzing the computational predictions of our model in multiple mutant backgrounds, we discovered that it fails to predict the absence of *tkv* expression in egg chambers with uniformly inhibited DPP signaling. Experimentally, this was implemented by uniform expression of Daughters against DPP (DAD), an intracellular inhibitor of DPP signaling; the efficiency of this inhibition is confirmed by the fact that the P-MAD is undetectable in egg chambers with uniformly expressed DAD (data not shown and ref. 31). In our model, DAD overexpression is described by setting $\alpha_{DPP} = 0$ for all locations at all times (see Eq. 1).

By in situ hybridization, we found that *tkv* expression is greatly reduced in this background (Fig. 4A). In contrast to this observation, our model predicts that the pattern of TKV expression would be unaffected by uniform inhibition of DPP signaling (Fig. 4B

Upper). Indeed, inhibition of DPP signaling should eliminate its repressive effect on BR which, according to the model, induces TKV at later stages of oogenesis. The necessity of this regulatory connection was based on the fact that *tkv* expression and P-MAD were eliminated in clones of *br*⁻ cells (6). At the same time, these previously published experiments have not explored whether BR is sufficient to induce *tkv*, and thus whether it is the only activator of *tkv* during late stages of oogenesis.

The discrepancy between the observed and predicted patterns of *tkv* led us to hypothesize that in addition to BR, the expression of TKV requires DPP signaling. Thus, we proposed that during the late stages of eggshell patterning, TKV controls its own expression via a positive feedback loop (Fig. 4C). To test the feasibility of this feedback, we used the CY2-Gal4 driver to express DPP uniformly throughout the follicular epithelium. This induced a dramatic change in the pattern of *tkv* expression. The low levels of *tkv* in the lateral and posterior areas of the wild-type follicular epithelium have been replaced with a strong domain of *tkv* expression (Fig. 4D). Overexpression of DPP in the posterior region by using the E4-Gal4 driver (active in the posterior of the egg chamber) also results in local up-regulation of *tkv* (data not shown).

These experiments support the proposed positive feedback loop. Because the mechanism of this feedback is currently unknown, it can be modeled in a number of different ways. DPP signaling can either positively regulate *tkv* transcription or stabilize the *tkv* transcript. Our computational results show that either of these mechanisms can repair the discrepancy between the predicted and observed patterns of *tkv* in the egg chambers with uniformly inhibited DPP signaling (Fig. 4B Lower; see SI Text for details). Importantly, the addition of this regulatory connection does not compromise the ability of the model to account for patterning defects in other mutants.

Discussion

We have developed a mechanistic model for BR regulation by the EGFR and DPP pathways in *Drosophila* oogenesis. Our model is relatively simple: it is quasi 1-dimensional, describes only a part of the genes acting in eggshell patterning, and employs switch-like nonlinearities to describe gene regulation. At the same time, the analysis of this model clearly demonstrates its ability to summarize a large number of experimental observations, predict dynamics of network components in genetic backgrounds of essentially arbitrary complexity, and guide further experimental studies of eggshell patterning. The model provides further support for the previously proposed feedforward-feedback mechanism and makes a number of testable predictions (6). For example, the model correctly predicted that BRK, which in other stages of fruit fly development antagonizes the effects of DPP signaling, indirectly controls the level of DPP signaling in late oogenesis by regulating the action of the negative feedback loop in the BR-patterning network. By systematically exploring network dynamics in mutant backgrounds, we identified a number of inconsistencies between the experimentally observed and model-predicted patterns. For instance, contrary to the model prediction, uniform inhibition of DPP signaling in the follicular epithelium leads to disappearance of the *tkv* transcript. This observation suggested the presence of an additional positive feedback loop between DPP signaling and DPP receptor expression. The possibility of this feedback is further supported by gain-of-function experiments.

In the future, our model can be extended to account for the 2-dimensional character of expression patterns in the follicular epithelium and other components of the eggshell-patterning network (21). For instance, a static description of the EGFR activation pattern in our model neglects the fact that at later stages of oogenesis, the oocyte-derived GRK input disappears and EGFR activation is mediated by Spitz, secreted by the *rhomboid*-expressing cells (25, 33–35). Because the model involves a feedback loop, the

continuous description of GRK production in this model may lead to oscillatory behavior of the system in even later stages of oogenesis; i.e., the repression of *br* by DPP signaling results in an eventual reduction of P-MAD, which is then unable to repress *br*, allowing its expression. This is contrary to experimental results that show that *br* expression remains undetectable throughout later stages of oogenesis. Replacing EGFR ligand from GRK to Spitz at late stages of oogenesis will eliminate EGFR signaling in the wide dorsal domain, preventing the system from entering the oscillatory regime.

Because of the modular structure of our mechanism and its mathematical representation, new components can be incorporated relatively straightforwardly into our computational model. As an example, recent experiments have shown that BR represses Cad74A, an atypical cadherin that is down-regulated in the roof cells and important for robust dorsal appendage morphogenesis (36). In combination with the simple repressive connection between BR and Cad74A, our model can predict how Cad74A responds to various perturbations of eggshell-patterning signals. Finally, we note that all of the regulatory connections in our model are yet to be verified by the detailed analysis of the *cis*-regulatory modules in the eggshell-patterning network.

Materials and Methods

Genetics. The following stocks were used in this study: wild-type OreR, X7;28.20 (which contains 4 copies of $P[w+ grk+]$ (2P[GRK]), ref. 37) and UAS-*Dad*, *CY2-UAS-Mae(ed)* (gifts from J. Duffy, Worcester Polytechnic Insti-

tute, Worcester, MA), UAS-*Dpp* (gift from T. Schüpbach, Princeton University), *CY2-Gal4* (38, 39), and *E4-Gal4* (38). To generate the *Ras* hypomorph mutant flies, *Ras85D^{E62K}* and *Ras85D⁰⁵⁷⁰³ry* (506)*cv-c* flies were crossed (both were gifts from C. Berg, University of Washington, Seattle). The FLP/FRT mitotic recombination system (40, 41) was used to generate clones of mutant follicle cells marked by the absence of GFP. The following flies were used to generate *Ras*⁻ clones: a null allele of *Ras*: *e22c-Gal4 UAS-FLP; FRT^{82B} ras^{ΔC40b}/FRT^{82B} ubi-GFP* (32, 42). To generate *pnt*⁻ clones, *w;pntLacZ/e22c-Gal4 UAS-FLP;pnt^{L88} FRT^{82B}* (gift from J. Duffy) were used, whereas *brk^{CAS4} FRT^{19A}; e22c-Gal4 UAS-FLP* (gift from T. Schüpbach) were used to generate *brk*⁻ clones. Flies were grown on agar cornmeal medium; baker yeast was added to the fly medium 24 h before ovary harvesting; all crosses were done at 23 °C.

In Situ Hybridization, Immunofluorescence, and Microscopy. In situ hybridization was carried out as described previously (6). The primary antibody of rabbit anti-P-Smad1/5/8 (1:3000) was a generous gift from D. Vasiliauskas (New York University, New York) and S. Morton, T. Jessell, and E. Laufer (Columbia University Medical Center, New York). Secondary antibodies AlexaFluor 568 anti-mouse, Oregon Green 488 anti-rabbit, and AlexaFluor 488 anti-sheep were used (1:2000; Molecular Probes). Images of immunofluorescence experiments were taken with a PerkinElmer RS3 Spinning Disk Confocal microscope and a Nikon Eclipse E800 compound microscope. Images were processed with ImageJ (Rasband, 1997–2006) and Photoshop (Adobe Systems).

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