

# Computational insights into *Caenorhabditis elegans* vulval development

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**Studies of *Caenorhabditis elegans* vulval development provide a paradigm for pattern formation during animal development. The fates of the six vulval precursor cells are specified by the combined action of an inductive signal that activates the EGF receptor mitogen-activated PK signaling pathway (specifying a primary fate) and a lateral signal mediated by LIN-12/Notch (specifying a secondary fate). Here we use methods devised for the engineering of complex reactive systems to model a biological system. We have chosen the visual formalism of statecharts and use it to formalize Sternberg and Horvitz's 1989 model [Sternberg, P. W. & Horvitz, H. R. (1989) *Cell* 58, 679–693], which forms the basis for our current understanding of the interaction between these two signaling pathways. The construction and execution of our model suggest that different levels of the inductive signal induce a temporally graded response of the EGF receptor mitogen-activated PK pathway and make explicit the importance of this temporal response. Our model also suggests the existence of an additional mechanism operating during lateral specification that prohibits neighboring vulval precursor cells from assuming the primary fate.**

computational modeling | statecharts | LIN-12/Notch

The increasing usefulness of computational models in biology has led to the development of many different types of modeling approaches (1–3). The resemblance between reactive systems (computerized systems that interact continuously with their environment) and biological systems suggests the use of methods devised for the construction of complex reactive systems to model biological systems (4, 5). Such methods have already been used to model specific aspects of T cell activation (5) and differentiation in the thymus (6). This study is part of an ongoing project to model vulval development in *Caenorhabditis elegans* (7, 8).

These efforts have used two complementary approaches to model biological behavior: an intraobject approach based on the language of *statecharts* (ref. 9; *Supporting Materials*, which is published as supporting information on the PNAS web site) and the RHAPSODY tool (ref. 10; *Supporting Materials*) and an interobject approach that uses the language of *live sequence charts* (LSCs) (11) and the PLAY-ENGINE tool (12). Both statecharts and LSCs are visual languages that have a clear and rigorously defined syntax and semantics that enable the construction and execution of a formal model. Statecharts specify the full state-based behaviors of each object in the system (e.g., a cell), whereas LSCs specify the multimodal (e.g., allowed, forbidden, and necessary) scenarios that link together the objects by their sequences of behavior.

For clarity, we refer to the working models that biologists usually represent in their articles by annotated pictures as “diagrammatic models.” These pictorial models themselves are static but are intended to be dynamically understood by the abstract reasoning of the reader. We contrast these with the kinds of “dynamic models” we construct, which are designed primarily for computerized execution and simulation by having formal support for their dynamic progression in time.

This article focuses on using statecharts to create a formal dynamic model of vulval fate specification based solely on the proposed diagrammatic model of Sternberg and Horvitz (13). The molecular and mechanistic aspects of vulval fate specification are currently understood at a much more detailed level than in 1989. Nonetheless, ref. 13 forms the basis for the current extended understanding of vulval fate specification by defining the relationships between two genetic mechanisms that underlie the cellular interactions involved in it. We stress that our dynamic model does not incorporate additional (newer) data than those in ref. 13.

The *C. elegans* vulva normally derives from three vulval precursor cells (VPCs) that are members of a larger set of six VPCs, P3.p–P8.p. Each of the six VPCs is multipotent, capable of adopting one of three fates, termed primary (1<sup>0</sup>), secondary (2<sup>0</sup>), or tertiary (3<sup>0</sup>) (13–15). The actual fate that each cell adopts depends on intercellular signals: an inductive signal emanating from the gonadal anchor cell (AC), a lateral signal between VPCs, and an inhibitory signal from the surrounding hypodermal syncytium. Despite the ability of each cell to adopt any of the three fates, the pattern of fates adopted by P3.p–P8.p in wild-type animals is always 3<sup>0</sup> 3<sup>0</sup> 2<sup>0</sup> 1<sup>0</sup> 2<sup>0</sup> 3<sup>0</sup>, respectively.<sup>¶</sup> VPC fates in wild-type animals are influenced by their distance from the AC: the cell closest to the AC (P6.p) becomes 1<sup>0</sup>, the next closest (P5.p and P7.p) become 2<sup>0</sup>, and the most distant cells (P3.p, P4.p, and P8.p) become 3<sup>0</sup> (17–19).

Sternberg and Horvitz (13) described the fates of the VPCs in animals in which the inductive, inhibitory, and lateral signaling pathways were perturbed in various combinations and manners. Here, as in ref. 13, we refer collectively to mutations that interfere with the inductive signaling pathway (causing a vulvaless phenotype) as *Vul* and to *lin-15* mutations that interfere with the inhibitory pathway (causing a multivulva phenotype) as *Muv*. Lateral signaling can be affected by mutations in *lin-12*, a gene that encodes a *C. elegans* member of the Notch family of receptors. The *Vul* genes act in the EGF receptor mitogen-activated PK (EGFR-MAPK) inductive signaling pathway. The inductive signal is encoded by the *Vul* gene *lin-3* (20, 21). Here, as in ref. 13, we refer to this signal as the inductive signal, whereas (in accordance with ref. 13) we refer to the response to this signal within the VPCs as the “vulval signal.” Although the *Muv* gene *lin-15* is currently considered part of the inhibitory pathway (22), it can be positioned in a genetic hierarchy so as to interfere with the vulval signal; mutation of *lin-15* results in activation of the vulval signal independent of the inductive signal. *lin-15* is treated in this manner in Sternberg and Horvitz (13), and we have dealt with it similarly here. In addition to reporting experimental data, Sternberg and Horvitz suggested a working model in diagrammatic form, supported by text, for interactions within and among VPCs during vulval induction (Fig. 1).

Abbreviations: VPC, vulval precursor cell; AC, anchor cell.

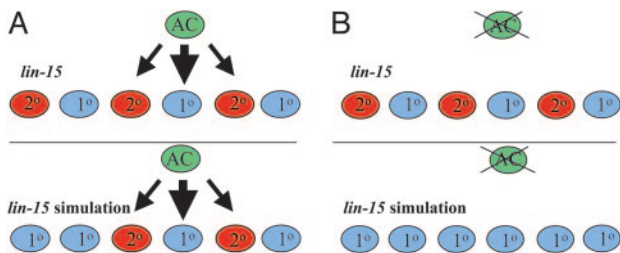
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<sup>¶</sup>In some animals, P3.p is not a member of the VPC equivalence group but instead fuses earlier with the hypodermal syncytium (16, 17).

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**Fig. 4.** Additional mechanism governing the lateral specification. Experimental results were compared with simulation results of *Muv* mutation in the presence (A) and absence (B) of AC.

between the two following sequences of events relevant to a given VPC:

- (i) Inductive signal  $\rightarrow$  vulval signal  $\rightarrow$  primary fate.
- (ii) Inductive signal received by neighbor  $\rightarrow$  vulval signal in neighbor  $\rightarrow$  lateral signal from neighbor  $\rightarrow$  increased *lin-12* activity  $\rightarrow$  secondary fate.

These two sequences of events need to be temporally prioritized, depending on the strength of the inductive signal received by an individual VPC and its neighboring VPCs. For example, the first of these sequences must proceed more rapidly than the second if a VPC exposed to the highest level of inductive signal is to acquire a  $1^0$  fate. Conversely, the second of these sequences must proceed more rapidly than the first if a VPC exposed to an intermediate level of inductive signal is to acquire a  $2^0$  fate. To effect this temporal prioritization, we had to introduce timing constraints into our dynamic computational model (Fig. 3A). Therefore, a mechanism was added by which a high inductive signal immediately induces a high vulval signal, whereas a medium inductive signal induces a medium vulval signal only after a time delay, arbitrarily set at 10 ms [the tm(10) arrow in Fig. 3B].

**Additional Control of Lateral Specification.** Representing the behavior of a *lin-15* mutant presented a second issue. The wild-type activity of *lin-15* normally constrains VPCs from adopting vulval fates unless they, or their neighbors, are exposed to the inductive signal (Movie 1, which is published as supporting information on the PNAS web site). Thus, in a *lin-15* mutant, all VPCs acquire one of the two vulval fates ( $1^0$  or  $2^0$ ) independently of the inductive signal. Although an isolated VPC in a *lin-15* mutant background acquires a primary fate, it is well accepted that a *lin-12*-mediated mechanism, termed lateral specification, prohibits adjacent VPCs from both acquiring primary fates (23, 24). Here, we suggest that additional control is needed for the lateral specification to inhibit adjacent primary cells.

In our initial dynamic model, simulating the behavior of *lin-15* mutants created adjacent primary fates in certain circumstances in which biological observations showed this to occur very rarely. The underlying problem was traced to the fact that in our initial dynamic model [reflecting the 1989 diagrammatic model (13)], the VPCs advanced toward acquiring their fates simultaneously. Thus, despite having represented the *lin-12*-mediated lateral specification mechanism in the dynamic computational model, either all VPCs engaged this mechanism simultaneously and became secondary, or all VPCs did not engage this mechanism (simultaneously) and became primary (which is the behavior of the model depicted in Fig. 3).

Two examples of this discrepancy were observed. In the presence of the AC, the behavior predicted by the initial statechart-based simulation of a *lin-15* mutant was the cell fate pattern  $1^0 1^0 2^0 1^0 2^0 1^0$  (Fig. 4A). By contrast, the actual biological outcome is either  $2^0 1^0 2^0 1^0 2^0 1^0/2^0$  or  $1^0 2^0 2^0 1^0 2^0$

$1^0/2^0$ . A second more blatant example was observed in the simulation of a *lin-15* mutant in which the AC had been ablated (Movie 2, which is published as supporting information on the PNAS web site). In this case, all VPCs were predicted by the model to become primary (Fig. 4B), whereas in the biological observations, adjacent primaries were extremely rare (13, 23). In this example, all of the VPCs became primary because they simultaneously reduced their ability to respond to the lateral signal and then sent lateral signals to their neighbors that were in turn ignored (simultaneously). The reason that P(5-7).p escape this simulation problem in the first example is that we had allocated a temporal priority to all VPC fates influenced by an inductive signal coming from the AC by delaying the response in VPCs that do not hear an inductive signal [the tm(5) arrow in Fig. 3B].

Therefore, we postulate that some additional mechanism is needed to allow different reactions to the lateral signal in neighboring VPCs. One possibility is to disallow the simultaneous progress of VPCs toward fate acquisition. For the simulations to fit the actual data for *lin-15* mutants, we added a special adjustment to our dynamic model to prohibit the simultaneous acquisition of vulval fates.

This simultaneity problem is reminiscent of a situation in computer science called “mutual exclusion,” causing us to seek a computational solution based on the way the mutual exclusion problem is solved in computer science. Mutual exclusion refers to a situation in which a number of processes compete for access to a common commodity, often called the critical section. The solutions must guarantee that eventually all processes get the commodity, but that no two access it simultaneously. In our system, the ability to assume a  $1^0$  fate can be viewed as the critical section, with the additional constraint that no two adjacent VPCs have the ability to assume  $1^0$  fates simultaneously. It is important to note that all VPCs have the ability to assume a primary fate, even though, in most cases, not all of the VPCs in fact do so. Indeed, in the wild type, only one cell adopts this fate.

The situation that adjacent VPCs cannot simultaneously adopt primary fates is akin to a well known variant of the mutual exclusion problem, Dijkstra’s “dining-philosophers” problem (25). This problem concerns six philosophers seated at a round table, alternating between phases of thinking and eating. Between every pair of neighboring philosophers, there is only a single fork (Fig. 7, which is published as supporting information on the PNAS web site). However, to eat, a philosopher has to acquire two forks, one to the right and one to the left of the place setting. The challenge is to devise a protocol for the philosophers to acquire, use, and release their forks in such a way that all of the philosophers eventually eat and none of them starves. A protocol to solve the dining-philosophers problem must satisfy the following requirements: mutual exclusion (no two philosophers use the same fork simultaneously) and freedom from deadlock and lockout (absence of starvation).

The dynamic model (as in Fig. 3) reproduces the erroneous behavior explained above. After a VPC enters state “ $1^0$  or  $2^0$ ” or “ $2^0$  or  $3^0$ ,” the lateral signal is perceived (and in this case ignored), and then the VPC proceeds to evaluate the condition on *lin-12* level and assumes its fate. To address our own version of this problem and to make our computational model match the biological observations as closely as possible, we implemented a solution to the dining-philosophers problem that appears in the computer science literature. We added two subcharts to the intermediate states “ $1^0$  or  $2^0$ ” and “ $2^0$  or  $3^0$ ” in the Main component of the VPC statechart (Fig. 8, which is published as supporting information on the PNAS web site). With these subcharts in place, whenever a VPC is in the process of assuming a fate, its two neighbors have to wait until it finishes deciding what fate it adopts. When that happens, the lateral signal of the cell takes effect on its neighbors and they, in turn, assume a



the lateral signaling. This prevents VPCs that receive a medium signal but subsequently acquire a 2<sup>0</sup> fate from inducing a 2<sup>0</sup> fate in their AC-distal neighboring VPCs.

Based on these two time-ordering constraints, we generated a sequence diagram (Fig. 5) describing the ordering (over time) of the events that we incorporated into our dynamic model to regulate VPC fate acquisition. This represents our suggestion for how the system may work, reflecting our computational solution. The time order of events is linked to the level of the inductive signal received by a VPC. The inductive signal induces a vulval signal, which in turn induces a reduction in the ability to respond to the lateral signaling [decrease in *lin-12* level (26)], followed by lateral signaling and fate acquisition (in that order). In a VPC that does not receive an inductive signal, there is a reduction in the ability to respond to the lateral signaling, followed by 3<sup>0</sup> fate acquisition. We find that these are the minimal requirements that make our computational model consistent with the actual data. Changing any of these constraints impairs our ability to mimic *in silico* the actual behavior of the VPC fate-specification system.

As discussed earlier, *lin-15* mutants require an additional mechanism governing the lateral specification that prohibits neighboring VPCs from assuming the primary fate. Without such a mechanism, and in the absence of the AC, all VPCs would adopt a primary fate. If we assume that all VPCs have the same “blueprint,” then either there is some external mechanism that prohibits them from advancing in exactly the same way and assuming primary fates, or there is some internal mechanism that forces them to assume different fates. Implementing an external mechanism that prohibits the cells from assuming fates simultaneously shows *in silico* that such a mechanism would indeed result in the desired phenotype.

Because the diagrammatic model was postulated in 1989 (13), explicit cellular and molecular mechanisms have begun to be elucidated that underlie some of the issues predicted by the diagrammatic model and highlighted by our formulation of the dynamic model. One example is the recent molecular identification of the lateral signal(s), which appears to consist of redundant soluble and membrane-bound ligands (27). A mechanism by which LIN-12 levels are reduced in response to induction [high vulval signal, in Sternberg and Horvitz’s model (13)] has also been recently elucidated and shown to occur by the degradation of the LIN-12 protein (26). Putative targets of LIN-12-mediated signaling have recently been identified. These include a host of genes [*ark-1*, *lip-1*, *lst-1-4*, and *dpy-23* (28–30)] whose products interfere with the EGF receptor mitogen-

activated PK (EGFR-MAPK) signaling pathway, helping to integrate these signaling pathways. Elucidation of the competition between the EGFR-MAPK signaling pathway and the lateral signaling pathway (28) has led Sternberg to suggest that the EGFR-MAPK signaling pathway should take long enough for the lateral signaling pathway to intercept it (31). Last, the time delay introduced between the 1<sup>0</sup> vs. 2<sup>0</sup> fate decision (“1<sup>0</sup> or 2<sup>0</sup>” state) and the 2<sup>0</sup> vs. 3<sup>0</sup> decision (“2<sup>0</sup> or 3<sup>0</sup>” state) is consistent with Ambros’ work (32) on cell cycle-dependent sequencing of VPC cell fate decisions and subsequent work (33). Having established the core of a dynamic computational model for VPC fate specification, it is now possible to extend this model to incorporate the many biological features that have greatly enhanced our understanding of this system.

This work represents a step toward modeling that more sophisticated understanding of VPC fate specification. A state-based mechanistic model is particularly well suited for capturing the level of understanding obtained using the tools and approaches common in the field of developmental genetics. Nonetheless, other means for representing continuous phenomena can be incorporated into object-oriented models that employ languages like statecharts, resulting in hybrid models. Our statechart model also has the potential of interacting with the developing live sequence chart model of VPC specification (7) to take advantage of the complementary strengths of these two related representations.

Executing the computational model allowed an investigation of two time-dynamic processes: signal reception/triggered events and subsequent fate decisions among initially equivalent cells. Just as building the kinds of diagrammatic models used in developmental genetics helps to clarify mechanistic interactions and generate hypotheses to focus future research efforts, formalizing these models into statecharts is an intuitive way to add temporal dynamics into the model, thereby enhancing our understanding of biology. We propose that formal models of biological processes based on the tools developed for complex reactive systems offer an especially effective tool for exploring time-dependent processes in biological systems.

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