## 3

# Dynamics of regulatory links

#### 3.1 Regulating a piece of DNA

**3.1.1** Consider a titration experiment that varies R concentration with a fixed operator concentration in order to probe the first-order chemical reaction  $R + O \leftrightarrow RO$ . Compare the fractions of bound [RO] to [O] as a function of  $[R_T]$ , for  $[O_T] = 10 K$  and K/10.

**Answer** As explained in the main text:

$$\frac{[\text{CIO}]}{[O_t]} = \frac{[\text{CI}]}{K + [\text{CI}]}$$
(3.1)

where K is the CI concentration at which [O] is half occupied. Here the free concentrations [CI] is less than the total concentrations, as

$$[CI_{total}] = [CI] + [CIO]$$
(3.2)

The equation where we ignore the operator's effect on free concentration of CI is:

$$\frac{[\text{CIO}]}{[\text{O}_{t}]} = \frac{[\text{CI}_{\text{total}}]}{K + [\text{CI}_{\text{total}}]}$$

In contrast, the complete equation is:

$$K = \frac{([CI_{total}] - [CIO])([O_t] - [CIO])}{[CIO]} \Rightarrow$$
$$[CIO] = \frac{[CI_{total}] + [O_t] + K}{2} - \sqrt{\frac{([CI_{total}] + [O_t] + K)^2}{4} - [CI_{total}][O_t]}$$

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Figure 3.1 Comparison between a case where there is a lot of DNA, and the case with little operator DNA using K = 1.

which we investigate in Fig. 3.1 for the case where K = 1 and  $[O_t] = 0.1$ , and  $[O_t] = 10$ , plotting in both cases  $[CIO]/[O_t]$ .

#### **3.2** Transcription regulation

**3.2.1** Simulate the three different regulatory systems in Fig. 3.5 by integrating the temporal evolution. Hint: for simple repression this amounts to  $C(t + dt) = C(t) + (\frac{1}{1+R} - C) \cdot dt$ , with dt = 0.01 from t = 0 to t = 10. Start by using R = 0.1 and initialize C at its steady-state value  $C = \tau/(R+1)$ ,  $C = 1/(R+1/\tau)$  and  $C = \tau R/(R+1)$ . At time t = 10 increase R by a factor of 100 to inspect the relaxation dynamics to the new steady state (integrating from t = 10 to t = 20). What parameter is important for determining the characteristic time of the relaxation, and what parameters define the steady state of C?

**Answer** Results as shown in the figure in main text.

(a) Steady state is determined by setting  $dC/dt = 0 \Rightarrow \frac{1}{1+R} = C/\tau$ , which implies that steady state  $C = \frac{\tau}{1+R}$  with a prefactor that will be given by promoter strength and number of proteins per mRNA. The response time, on the other hand, is simply equal to  $\tau$ , as  $C \propto \exp(-t/\tau)$ 

(b) Steady state is determined from  $C = 1/(R+1/\tau)$  with the prefactor given by overall promoter strength and a rescaling of the "R" factor proportional to the strength of the proteolytic degradation. The relaxation to new steady



Figure 3.2 Self repression and response using a reservoir as a buffer. Gray area marks the value of R/10.

state is given by  $C \propto \exp(-(R + \frac{1}{\tau}) \cdot t)$ , and thus becomes very fast if the activity of R is large.

(c) Steady state is  $C = \frac{\tau R}{R+1}$  with relaxation given by  $C \propto \exp(-t/\tau)$ .

**3.2.2** Simulate the two regulatory systems in Fig. 3.6. For the right-hand panel use  $\tau = 1$ , and investigate also  $\tau = 10$ .

Answer The simulations are conducted in discrete time steps of size, say, dt = 0.01, with = 0.01 for t < 0 and R = 10 for t > 0. Initially, the system is started at t = -10 and will reach steady state long before the switch in R. The result is shown in Fig. 3.2.

(A) Simulation of  $dC/dt = (R/R+1) \cdot (2/(10C+1) - C \text{ (red)} and <math>dC/dt = (R/R+1) - C \text{ (blue)}$ . Notice the thin red curve, which shows the behavior of the self-repressed system (red) when rescaled to the final steady-state value at R = 10. The system is seen to respond faster because it initially responds without sensing its final repressed value.

(B) Notice the overshoot of C, reflecting a fast conversion of a reservoir of m. This type of response is part of the unfolded protein response, where a passive mRNA is activated through cleaving by the protein Ire1.



Figure 3.3 Simulation of activation of a small RNA on the expression of its target mRNA. The gray area marks value of  $\alpha$ .

### 3.3 Post-transcription regulation

**3.3.1** Consider the sRNA regulations from Eqs. (3.21) and (3.22) with parameter  $\gamma = 10$ ,  $\gamma = 100$ , respectively  $\gamma = 1000$ . Calculate the steady-state concentration mRNA at  $\alpha = 0.1$ , then shift to  $\alpha = 4$  and simulate the response. Use  $\tau = 1$ .

**Answer** Simulate the equations:

$$ds = dt \cdot (\alpha - \gamma \cdot s \cdot m - s)$$
$$dm = dt \cdot (1 - \gamma \cdot s \cdot m - m)$$

with  $dt < \gamma \alpha$ , for example use dt = 0.0001. Switch from  $\alpha = 0.1$  at t < 0 to  $\alpha = 4$  at larger times. The result is shown in Fig. 3.3

**3.3.2** Simulate activation and de-activation of a small RNA on the expression of its target mRNA with  $\alpha = 0.1 \rightarrow \alpha = 4 \rightarrow \alpha = 0.1$ , and  $\gamma = 100$ ,  $\tau = 1$ . Repeat the simulation for  $\alpha = 0.1 \rightarrow \alpha = 40 \rightarrow \alpha = 0.1$  and  $\gamma = 100$ ,  $\tau = 1$ .

**Answer** Simulate the equations:

$$ds = dt \cdot (\alpha - \gamma \cdot s \cdot m - s)$$
$$dm = dt \cdot (1 - \gamma \cdot s \cdot m - m)$$



Figure 3.4 Simulation of activation and deactivation of a small RNA on the expression of its target mRNA. Gray area marks value of  $\alpha$ .

with  $dt < \gamma \alpha$ , for example use dt = 0.0001. The result is shown in Fig. 3.4. Notice that large intermediate production of  $\alpha$  makes recovery slow.

**3.3.3** Examine the indirect regulation caused by a protein R that sequesters a transcriptional repressor C as a function of the concentration of R with fixed C = 1. Assume that C only represses the promoter in its free form. This can be done by plotting the activity of the repressed promoter as one varies R around the critical value C = 1, for different values of  $K_0$  and K, with  $K \cdot K_0 = 10^{-4}$  being fixed.

**Answer** Plot as a function of R, the function:

Activity(R) = 
$$\frac{1}{1 + C_{\rm f}/K_{\rm o}}$$
  
 $C_{\rm f} = \frac{1}{2} \cdot (1 - R - K) + \sqrt{\frac{1}{4} \cdot (1 + R + K)^2 - R}$ 

for the different values of K and  $K_o$ , see Fig. 3.5. As R increases, the repressor C is sequestered and therefore its inhibition is removed. As an result the regulator R effectively acts as an activator. Importantly, when binding



Figure 3.5 Activity of a promoter that is repressed by a protein, which in turn is sequestered by another protein.

between R and C is strong, the activation function exhibits a high Hill coefficient.

Noticeably, one may alternatively vary the repressor concentration C for a fixed value of R = 1. This amounts to plotting:

Activity(C) = 
$$\frac{1}{1 + C_{\rm f}/K_{\rm o}}$$
  
 $C_{\rm f} = \frac{1}{2} \cdot (C - 1 - K) + \sqrt{\frac{1}{4} \cdot (C + 1 + K)^2 - C}$ 

a dependence shown in Fig. 3.6. Importantly, when binding between R and C is strong, the activation function exhibits a high Hill coefficient.

**3.3.4** Consider a simplified toxin-anti-toxin system of two proteins T and A, where free  $A(A_f)$  is a repressor of T:

$$\frac{\mathrm{d}T}{\mathrm{d}t} = \frac{1}{1 + A_{\mathrm{f}}/K_{\mathrm{o}}} - T/10 \tag{3.3}$$

where  $A_{\rm f}$  is given by the total toxin amount T with an A:T binding constant K = 0.01. Set  $K_{\rm o} = 0.01$  and investigate fixed points for the above equation



Figure 3.6 Activity of a promoter that is repressed by a protein, that in turn is sequestered by another protein.



Figure 3.7 Production and decay of a toxin T as function of a fixed amount of antitoxin A. In the real toxin–anti-toxin systems, the toxins are short-lived, whereas anti-toxins are long-lived. Thus one may investigate fluctuations in T around fixed points set by the slowly varying antitoxin A (Kenn Gerdes, private communication)

when total A = 0.1, A = 1 and A = 10. For literature on TA systems see [127, 128].

Answer

$$\frac{\mathrm{d}T}{\mathrm{d}t} = \frac{1}{1 + A_{\mathrm{f}}/K_{\mathrm{o}}} - T/10 = 0 \Rightarrow$$
$$K_{\mathrm{o}}/A = K_{\mathrm{o}} + A_{\mathrm{f}}$$

where the concentration of free A,  $A_{\rm f}$ , is calculated from the part of A that is not sequestered by T, giving:

Production of 
$$T = \frac{K_o}{K_o + \frac{1}{2} \cdot (A - T - K) + \sqrt{\frac{1}{4} \cdot (A + T + K)^2 - A \cdot T}}$$
  
Decay of  $T = T/10$ 

which is plotted for A = 0.1, A = 1 and A = 10 in Fig. 3.7. Intersections define fixed points. With three intersections there are two stable and one unstable fixed point in the middle. The two stable fixed points correspond to a *T*-dominated state and an *A*-dominated states, respectively. For literature on real TA systems see:

K. Gerdes and E. Maisonneve, Bacterial persistance and toxin-antitoxin loci. *Annu. Rev. Microbiol.* 66: 103–123 2012.

I. Cataudella K. Sneppen, K. Gerdes and N. Mitarai, Conditional cooperativity in toxin-antitoxin regulation prevents random toxin activation and promotes fast translational recovery. *Nucl. Acids Res.* 40:6424, 2012.