Modelling Our System

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Slide2: General Derivation

Assumptions:

- •Concentration of promoters is constant
- Promoter P and activator A are in equilibrium with their complex PA
- •The reaction forming the protein Z is irreversible
- •Note: Contrarily to Michaelis-Menten, the substrate is not used up & the protein Z rebinds the promoter

$$P + A \xleftarrow{k_{-1}, k_{1}} PA \xrightarrow{k_{2}} Z$$

$$\frac{d[PA]}{dt} = k_{1}[P][A] - k_{-1}[PA] = 0 \quad \text{(steady state reached quickly if } k_{1} > k_{-1}\text{)}$$

(1)
$$[PA] = \frac{k_1[P][A]}{k_1} = \frac{[P][A]}{K_D}$$
 where $K_D \equiv \frac{k_{-1}}{k_1}$

Note: in Michaelis-Menten
$$K_m = \frac{k_{-1} + k_2}{k_1} \approx \frac{k_{-1}}{k_1} = \frac{1}{K_D}$$
 if $k_2 \ll k_{-1}$

As the total concentration of promoters is constant:

$$[P_0] = [P] + [PA]$$
 :: $[P] = [P_0] - [PA]$

Substituting into (1):

$$[PA] = \frac{[P][A]}{K_{D}} = \frac{([P_{0}] - [PA])[A]}{K_{D}} \qquad \therefore [PA] = \frac{[A][P_{0}]}{K_{D} + [A]}$$

The rate of protein synthesis is described by:

$$\frac{d[Z]}{dt} = k_2[PA] = \frac{k_2[P_0][A]}{K_D + [A]} = \frac{V_{max}[A]}{K_D + [A]} \quad \text{where } V_{max} \equiv k_2[P_0]$$

Key:

P: Promoter pLuxR

A: AHL/LuxR complex

PA: pLuxR/AHL/LuxR complex

Z: GFP

Note:

 $AHL + LuxR \leftrightarrow AHL/LuxR$

LuxR is present in excess of AHL.

The protein Z (AHL) associates with LuxR to form A. Thus, Z indirectly becomes the activator A.

Modelling T9002

AHL + LuxR $\leftarrow \xrightarrow{k_{-\alpha}, k_{\alpha}} A$ (Assuming all stochiometric numbers as shown)

$$\frac{d[A]}{dt} = k_{\alpha}[AHL][LuxR] - k_{-\alpha}[A] = 0 \quad \text{(steady-state)}$$

LuxR is constitutively produced and reaches steady state before AHL is added.

[LuxR] can be approximated as a constant: [LuxR] $\approx \lambda$

$$\therefore \frac{[AHL][LuxR]}{[A]} = \frac{\lambda[AHL]}{[A]} = \frac{k_{-\alpha}}{k_{\alpha}} = \frac{1}{K_{D\alpha}} \qquad \therefore (2) \quad [A] = \lambda K_{D\alpha}[AHL]$$

$$P + A \xleftarrow{k_{-1}, k_1} PA \xrightarrow{k_2} Z$$

The rate of protein synthesis is described by:

$$\frac{d[Z]}{dt} = k_2[PA] = \frac{k_2[P_0][A]}{[A] + K_D} = \frac{V_{max}[A]}{[A] + K_D} \quad \text{where } V_{max} \equiv k_2[P_0]$$

(see Slide No. 2 for derivation)

The total change in protein concentration includes protein degradation:

$$\frac{d[Z]}{dt} = \frac{V_{\text{max}}[A]}{[A] + K_D} - \delta_2[Z]$$

Substituing Equation (2):
$$\frac{d[Z]}{dt} = \frac{V_{\text{max}} \lambda K_{\text{D}\alpha}[AHL]}{\lambda K_{\text{D}\alpha}[AHL] + K_{\text{D}}} - \delta_2[Z]$$

Rearranging and substituting for Z:

(3)
$$\frac{\text{d[GFP]}}{\text{dt}} = \frac{V_{\text{max}}[\text{AHL}]}{[\text{AHL}] + \frac{K_{\text{D}}}{\lambda K_{\text{D}\alpha}}} - \delta_{\text{GFP}}[\text{GFP}]$$

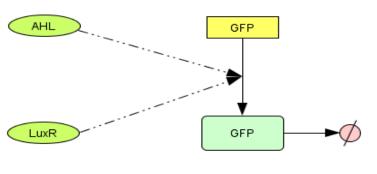
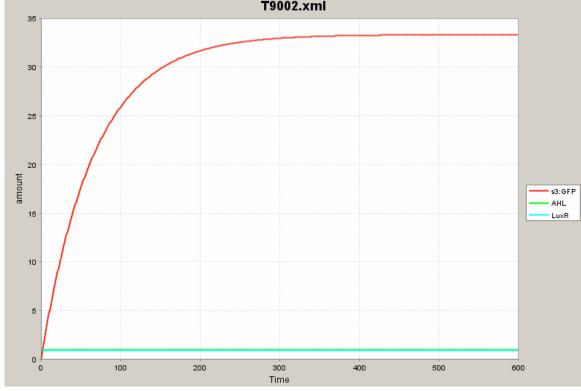


Fig.1a: Diagram for model in cell designer



$$\frac{d[GFP]}{dt} = \frac{V_{max}[AHL]}{[AHL] + K_{D}/\lambda K_{Da}} \delta - [GFP]$$

Known or measurable parameters:

• [GFP], [AHL], GFP degradation

Parameters to extract from model:

•
$$V_{\text{max}}$$
, $\lambda_{\text{D}} / \lambda_{\text{K}_{\text{D}\alpha}}$

Fig.1b: Output from the model in Fig.1a

Input Values used to generate above graph:

Extracting parameters: T9002

Measurements are taken after [GFP] has reached steady state ($\frac{d[GFP]}{dt}$ =0):

$$\begin{split} \frac{\text{d}[GFP]}{\text{d}t} &= \frac{V_{\text{max}}[AHL]}{K_1 + [AHL]} - \delta_{\text{GFP}}[GFP] = 0 \qquad \text{where } K_1 \equiv \frac{K_D}{\lambda K_{D\alpha}} \\ & \therefore \ \delta_{\text{GFP}}[GFP] = \frac{V_{\text{max}}[AHL]}{K_1 + [AHL]} \\ & \text{Lineweaver-Burk:} \ \frac{1}{\delta_{\text{GFP}}[GFP]} = \frac{K_1 + [AHL]}{V_{\text{max}}[AHL]} = \frac{K_1}{V_{\text{max}}} \frac{1}{[AHL]} + \frac{1}{V_{\text{max}}} \quad \text{(Plot of } \frac{1}{\delta_{\text{GFP}}[GFP]} \text{ versus } \frac{1}{[AHL]} \text{)} \\ & \text{Eadie-Hofstee} : \ \delta_{\text{GFP}}[GFP](K_1 + [AHL]) = V_{\text{max}}[AHL] \\ & \delta_{\text{GFP}}[GFP][AHL] = - \delta_{\text{GFP}}[GFP]K_1 + V_{\text{max}}[AHL] \\ & \delta_{\text{GFP}}[GFP] = - \delta_{\text{GFP}}K_1 \frac{[GFP]}{[AHL]} + V_{\text{max}} \quad \text{(Plot of } \delta_{\text{GFP}}[GFP] \text{ versus } \frac{[GFP]}{[AHL]} \text{)} \end{split}$$

Modelling J37015

Key:

P: Promoter pLuxR

A: AHL/LuxR complex

PA: pLuxR/AHL/LuxR complex

Z: AHL

Note:

 $AHL + LuxR \leftrightarrow AHL/LuxR$

LuxR is present in excess of AHL.

The protein Z (AHL) associates with LuxR to form A. Thus, Z indirectly becomes the activator A.

AHL + LuxR $\xleftarrow{k_{-\alpha}, k_{\alpha}}$ A (Assuming all stochiometric numbers as shown)

$$\frac{d[A]}{dt} = k_{\alpha}[AHL][LuxR] - k_{-\alpha}[A]$$

LuxR is constitutively produced and reaches steady state before AHL is added.

[LuxR] can be approximated as a constant: [LuxR] $\approx \lambda$

$$\frac{d[A]}{dt} = k_{\alpha} \lambda [AHL] - k_{-\alpha} [A] = 0 \text{ (steady-state)}$$

$$\therefore \frac{[AHL]}{[A]} = \frac{k_{-\alpha}}{\lambda k_{\alpha}} = \frac{1}{\lambda K_{D\alpha}} \qquad \therefore (4) \quad [A] = \lambda K_{D\alpha}[AHL]$$

$$P + A \xleftarrow{k_1, k_1} PA \xrightarrow{k_2} Z$$

The rate of protein synthesis is described by:

$$\frac{d[Z]}{dt} = k_2[PA] = \frac{k_2[P_0][A]}{[A] + K_P} = \frac{V_{max}[A]}{[A] + K_P} \quad \text{where } V_{max} \equiv k_2[P_0]$$

(see Slide No. 2 for derivation)

The total change in protein concentration includes protein degradation:

$$\frac{d[Z]}{dt} = \frac{V_{\text{max}}[A]}{[A] + K_{D}} - \delta_{l}[Z]$$

Substituting Equation (4):
$$\frac{d[Z]}{dt} = \frac{V_{\text{max}} \lambda K_{D\alpha}[AHL]}{\lambda K_{D\alpha}[AHL] + K_{D}} - \delta_1[Z]$$

Since AHL/LuxR complex is in equilibrium with AHL, we can approximate:

(5)
$$\frac{d[AHL]}{dt} = \frac{V_{\text{max}}[AHL]}{[AHL] + K_{\text{D}}/\lambda K_{\text{D}\alpha}} - \delta_{\text{AHL}}[AHL]$$

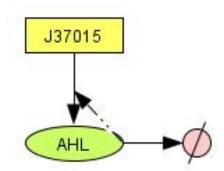


Fig.2a: Diagram for model in cell designer

$$\frac{\text{d[AHL]}}{\text{dt}} = \frac{V_{\text{max}}[\text{AHL}]}{[\text{AHL}] + K_{\text{D}}/\lambda K_{\text{D}\alpha}} - \delta_{\text{AHL}}[\text{AHL}]$$

Known or measurable parameters:

• [AHL], AHL degradation

Parameters to extract from model:

$$\bullet$$
 V $_{ ext{max}}$, $K_{ ext{D}}$ $\lambda K_{ ext{D}lpha}$

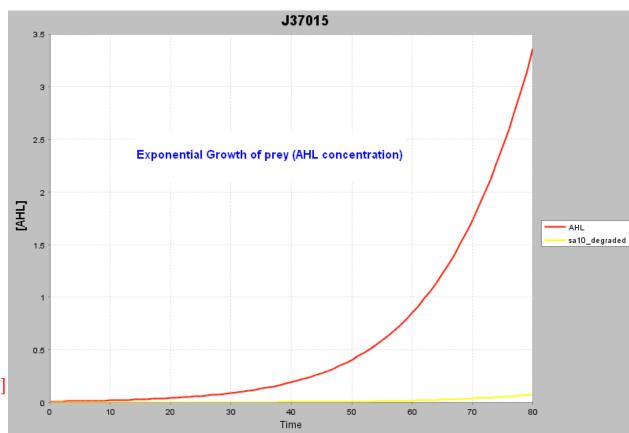


Fig.2b: Output from the model in Fig.2a

Values used for graph:

$$V_{\text{max}} = 1.245$$
, $K_{D} / K_{D\alpha} = 15$, $\lambda = 1$, $\delta_1 = 0.0016 \text{ s}^{-1}$

Extracting parameters: J37015

AHL is measured during exponential growth (not at steady state).

The following ODE thus needs to be solved:

$$\frac{d[AHL]}{dt} = \frac{V_{max}[AHL]}{K_{D}} - \underbrace{\int_{Since \delta_{AHL}is \ very \ small, this term \ can be neglected}}_{Since \delta_{AHL}is \ very \ small, this term \ can be neglected}$$

$$\frac{d[AHL]}{dt} = \frac{V_{max}[AHL]}{K_1 + [AHL]} \quad \text{where} \quad K_1 \equiv \frac{K_D}{\lambda K_{D\alpha}}$$

$$\frac{d[AHL]}{[AHL]}(K_1 + [AHL]) = V_{max} dt$$

$$\int d[AHL] + \int K_1 \frac{d[AHL]}{[AHL]} = \int V_{max} dt$$

$$[AHL] + K_1 ln[AHL] = V_{max} t + c$$
Rearranging for a plot of t versus [AHL]:
$$t = \frac{1}{V_{max}}([AHL] + K_1 ln[AHL] + c)$$

Modelling J37016

AHL + LuxR \leftarrow $\xrightarrow{k_{-\alpha}, k_{\alpha}}$ A (Assuming all stochiometric numbers as shown)

 $\frac{d[A]}{dt} = k_{\alpha}[AHL][LuxR] - k_{-\alpha}[A] = 0 \text{ (because of steady state)}$

$$\therefore \frac{[AHL][LuxR]}{[A]} = \frac{k_{-\alpha}}{k_{\alpha}} = \frac{1}{K_{D\alpha}} \qquad \therefore (6) \quad [A] = K_{D\alpha}[AHL][LuxR]$$

$$P+A \xleftarrow{\quad k_{-1} \quad , \ k_1 \quad} PA \xrightarrow{\quad k_2 \quad} Z$$

The rate of protein synthesis is described by:

$$\frac{d[Z]}{dt} = k_2[PA] = \frac{k_2[P_0][A]}{[A] + K_P} = \frac{V_{max}[A]}{[A] + K_P} \quad \text{where } V_{max} \equiv k_2[P_0]$$

(see Slide No. 2 for derivation)

The total change in protein concentration includes protein degradation:

$$\frac{d[Z]}{dt} = \frac{V_{max}[A]}{[A] + K_{D}} - \delta_{2}[Z]$$

Substituing Equation (6):
$$\frac{d[Z]}{dt} = \frac{V_{\text{max}} K_{D\alpha}[AHL][LuxR]}{K_{D\alpha}[AHL][LuxR] + K_D} - \delta_2[Z]$$

There are two different products being transcribed: LuxR and GFP.

Considering both products after another, keeping in mind they are measured at steady state:

(7)
$$\frac{d[LuxR]}{dt} = \frac{V_{max}[AHL][LuxR]}{[AHL][LuxR] + K_{D/K_{Dec}}} - \delta_{LuxR}[LuxR] = 0$$

(8)
$$\frac{d[GFP]}{dt} = \frac{V_{max}[AHL][LuxR]}{[AHL][LuxR] + K_{D/K_{Dec}}} - \delta_{GFP}[GFP] = 0$$

$$\therefore (7) = (8) \Rightarrow \delta_{\text{LuxR}}[\text{LuxR}] = \delta_{\text{GFP}}[\text{GFP}] \Rightarrow [\text{LuxR}] = \frac{\delta_{\text{GFP}}}{\delta_{\text{LuxP}}}[\text{GFP}]$$

P: Promoter pLuxR

A: AHL/LuxR complex

PA: pLuxR/AHL/LuxR complex

Z: GFP and LuxR

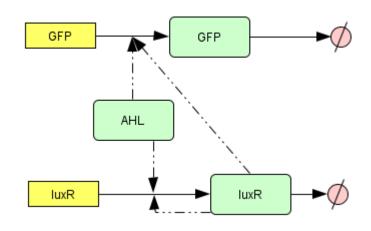
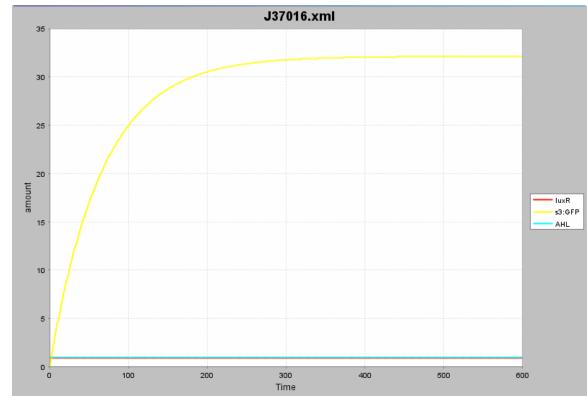


Fig.3a: Diagram for model in cell designer



$$\frac{\text{d[GFP]}}{\text{dt}} = \frac{V_{\text{max}}[\text{AHL}][\text{LuxR}]}{[\text{AHL}][\text{LuxR}] + \frac{K_{\text{D}}}{K_{\text{D}\alpha}}} - \delta_{\text{GFP}}[\text{GFP}]$$

Known or measurable parameters:

• [AHL], GFP degradation

Parameters to extract from model:

$$\cdot$$
 $\mathsf{V}_{\mathsf{max}}$, K_{D}

Fig.3b: Output from the model in Fig.3a

Input values used to generate above graph:

Extracting parameters: J37016

Measurements are taken after [GFP] has reached steady state ($\frac{d[GFP]}{dt}$ =0):

$$\frac{\text{d}[GFP]}{\text{dt}} = \frac{V_{\text{max}}[AHL][LuxR]}{K_2 + [AHL][LuxR]} - \delta_{\text{GFP}}[GFP] = 0 \quad \text{where } K_2 \equiv \frac{K_D}{K_{\text{0}}} \quad \text{and } [LuxR] = \frac{\delta_{\text{GFP}}}{LuxR}[GFP]$$

$$\therefore \delta_{\text{GFP}}[GFP] = \frac{V_{\text{max}}[AHL][LuxR]}{K_2 + [AHL][LuxR]} = \frac{K_2 + [AHL][LuxR]}{V_{\text{max}}[AHL][LuxR]} = \frac{1}{V_{\text{max}}} \quad \text{(Plot of } \frac{1}{\delta_{\text{GFP}}[GFP]} \text{ versus } \frac{1}{[AHL]})$$

$$\text{Eadie-Hofstee} : \delta_{\text{GFP}}[GFP](K_2 + [AHL][LuxR]) = V_{\text{max}}[AHL][LuxR]$$

$$\delta_{\text{GFP}}[GFP][AHL][LuxR] = -\delta_{\text{GFP}}[GFP]K_2 + V_{\text{max}}[AHL][LuxR]$$

$$\delta_{\text{GFP}}[GFP] = -\delta_{\text{GFP}}K_2 = \frac{[GFP]}{[AHL][LuxR]} + V_{\text{max}} \quad \text{(Plot of } \delta_{\text{GFP}}[GFP] \text{ versus } \frac{[GFP]}{[AHL][LuxR]})$$

Modelling J37022 (AHL)

Key:

E: Enzyme AHL-lactonase

S: AHL

ES: aiiA/AHL complex

Z: Acyl-HS

True Michaelis-Menten:

$$E + S \xleftarrow{k_{-1}, k_1} ES \xrightarrow{k_2} E + Z$$

$$\frac{d[ES]}{dt} = k_1[E][S] - k_{-1}[ES] - k_2[ES] = 0$$

(9)
$$[ES] = \frac{k_1[E][S]}{k_{-1} + k_2} = \frac{[E][S]}{K_m}$$
 where $K_m = \frac{k_{-1} + k_2}{k_1}$

As the total concentration of enzyme is constant:

$$[E_0] = [E] + [ES]$$
 $\therefore [E] = [E_0] - [ES]$

Substituting into (1):

[ES] =
$$\frac{[E][S]}{K_m} = \frac{([E_0] - [ES])[S]}{K_m}$$
 :: [ES] = $\frac{[S][E_0]}{K_m + [S]}$

The rate of degradation of substrate (activity of enzyme) is described by:

$$-\frac{d[S]}{dt} = k_2[ES] = \frac{k_2[E_0][S]}{K_m + [S]} = \frac{V_{max}[S]}{K_m + [S]} \quad \text{where } V_{max} \equiv k_2[E_0]$$

The total rate of degradation of AHL (activity of aiiA) is described by:

(10)
$$\frac{\text{d[AHL]}}{\text{dt}} = -\frac{V_{\text{max}}[\text{AHL}]}{K_{\text{m}} + [\text{AHL}]} - \delta_{\text{AHL}}[\text{AHL}] = -\frac{k_{2}[E_{0}][\text{AHL}]}{K_{\text{m}} + [\text{AHL}]} - \delta_{\text{AHL}}[\text{AHL}]$$

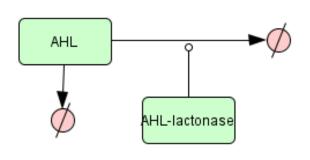


Fig.4a: Diagram for model in cell designer

$$\frac{d[AHL]}{dt} = -\frac{k_2[E_0][AHL]}{K_m + [AHL]} - \delta_{AHL}[AHL]$$

Known or measurable parameters:

• IPTG, aiiA degradation

Parameters to extract from model:

 $\bullet V_{\text{max}}, K_{\text{D}}$

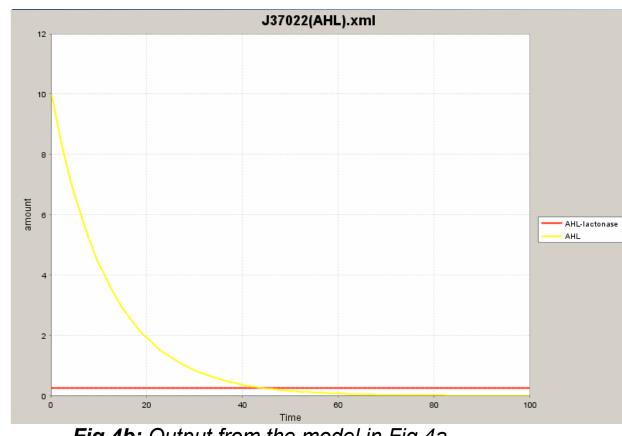


Fig.4b: Output from the model in Fig.4a

Input values used to generate above graph:

$$\delta_{AHL} = 0.00048$$
 , $K_{m} = 331.95$

$$V_{max} = 1.0$$
 , [AHL] = 1.0

$$k_2 = 1000.0$$
 , $E_0 = 1.0$

Extracting parameters: J37022(AHL)

Measurements are taken after [AHL] has reached steady state ($\frac{d[AHL]}{dt}$ =0):

$$\frac{d[AHL]}{dt} = -\frac{k_2[E_0][AHL]}{K_m + [AHL]} - \delta_{AHL}[AHL] = 0$$

$$\therefore \delta_{AHL} [AHL] = -\frac{k_2[E_0][AHL]}{K_m + [AHL]}$$

Lineweaver-Burk:
$$\frac{1}{\delta_{\text{AHL}}[\text{AHL}]} = -\frac{K_{\text{m}} + [\text{AHL}]}{k_2[E_0][\text{AHL}]} = -\frac{K_{\text{m}}}{k_2[E_0]} \frac{1}{[\text{AHL}]} - \frac{1}{k_2[E_0]} \quad (\text{Plot of } \frac{1}{\delta_{\text{AHL}}[\text{AHL}]} \text{ versus } \frac{1}{[\text{AHL}]})$$

$$\begin{split} \text{Eadie-Hofstee}: \ \delta_{\text{AHL}} \left[\text{AHL} \right] & (K_{\text{m}} + [\text{AHL}]) = -\,k_2[E_0] [\text{AHL}] \\ \delta_{\text{AHL}} \left[\text{AHL} \right]^2 & = -\,\delta_{\text{AHL}} \left[\text{AHL} \right] K_{\text{m}} - k_2[E_0] [\text{AHL}] \\ \delta_{\text{AHL}} \left[\text{AHL} \right] & = -\,\delta_{\text{AHL}} \, K_{\text{m}} - k_2[E_0] \quad \text{(Plot of } \delta_{\text{AHL}} \left[\text{AHL} \right] \text{ versus ?)} \end{split}$$

Modelling J37022 (aiiA)

Key:

P: Promoter LacI

A: IPTG

PA: LacI/IPTG complex

Z: aiiA

$$P + A \xleftarrow{k_1, k_1} PA \xrightarrow{k_2} Z$$

The rate of protein synthesis is described by:

$$\frac{d[Z]}{dt} = k_2[PA] = \frac{k_2[P_0][A]}{[A] + K_D} = \frac{V_{max}[A]}{[A] + K_D} \quad \text{where } V_{max} \equiv k_2[P_0]$$

(see Slide No. 2 for derivation)

The total change in protein concentration includes protein degradation:

$$\frac{d[Z]}{dt} = \frac{V_{\text{max}}[A]}{[A] + K_{D}} - \delta_{\text{aii}A}[Z]$$

(11)
$$\frac{d[aiiA]}{dt} = \frac{V_{max}[IPTG]}{[IPTG] + K_{D}} - \delta_{aiiA}[aiiA]$$

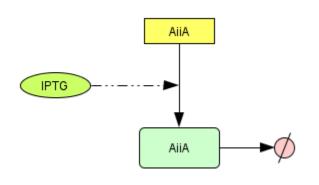
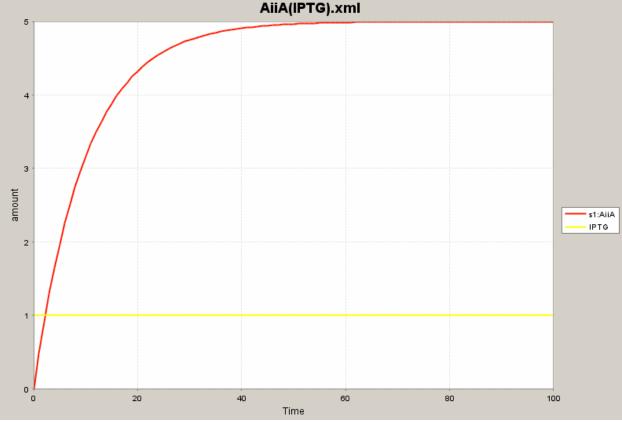


Fig.5a: Diagram for model in cell designer



$$\frac{\text{d[aiiA]}}{\text{dt}} = \frac{V_{\text{max}}[\text{IPTG}]}{[\text{IPTG}] + K_{\text{D}}} - \delta_{aiiA}[\text{aiiA}]$$

Known or measurable parameters:

• IPTG, aiiA degradation

Parameters to extract from model:

 \bullet V_{max} , K_{D}

Fig.5b: Output from the model in Fig.5a

Input values used to generate above graph:

$$\delta_{Aiia} = 0.1$$
 (real value to be found)

$$K_D = 1.0$$
 (real value to be found)

$$V_{\text{max}} = 1.0$$
 (real value to be found)

$$[IPTG] = 1.0$$

Extracting parameters: J37022(aiiA)

Measurements are taken after [aiiA] has reached steady state ($\frac{d[AHL]}{dt}$ =0):

$$\frac{d[aiiA]}{dt} = \frac{V_{max}[IPTG]}{K_D + [IPTG]} - \delta_{aiiA}[aiiA] = 0$$

$$\therefore \delta_{aiiA} [aiiA] = \frac{V_{max}[IPTG]}{K_D + [IPTG]}$$

Lineweaver-Burk:
$$\frac{1}{\delta_{aiiA} [aiiA]} = \frac{K_D + [IPTG]}{V_{max} [IPTG]} = \frac{K_D}{V_{max}} \frac{1}{[IPTG]} + \frac{1}{V_{max}} \quad (Plot \ of \ \frac{1}{\delta_{aiiA} [aiiA]} \ versus \ \frac{1}{[IPTG]})$$

Eadie-Hofstee :
$$\delta_{aiiA}$$
 [aiiA](K_D+[IPTG]) = V_{max}[IPTG]
 δ_{aiiA} [aiiA][IPTG] = δ - $_{aiiA}$ [aiiA]K $_{D}$ V $_{max}$ [IPTG]
 δ_{aiiA} [aiiA] = $-\delta_{aiiA}$ K $_{D}$ $\frac{[aiiA]}{[IPTG]}$ + V_{max} (Plot of δ_{aiiA} [aiiA] versus $\frac{[aiiA]}{[IPTG]}$)

Modelling the Overall System

Assumptions:

AHL is diffusing freely throughout the system

Three resulting equations describing the Overall System:

(from the previously derived equations 5, 7, 8, 10, 11)

$$\frac{d[AHL]}{dt} = \frac{V_{max}[AHL]}{[AHL] + K_{D} \atop dt} - \frac{k_{2}[aiiA][AHL]}{K_{m} + [AHL]} - \delta_{AHL}[AHL]$$

$$\frac{d[aiiA]}{dt} = \frac{V_{max}[AHL][LuxR]}{[AHL][LuxR] + K_{D} \atop dt} - \delta_{aiiA}[aiiA]$$

$$\frac{d[LuxR]}{dt} = \frac{V_{max}[AHL][LuxR]}{[AHL][LuxR] + K_{D} \atop dt} - \delta_{2LuxR}[LuxR]$$

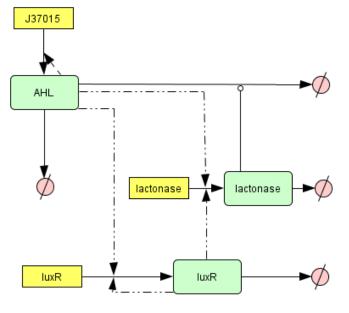


Fig.6a: Diagram for model in cell designer

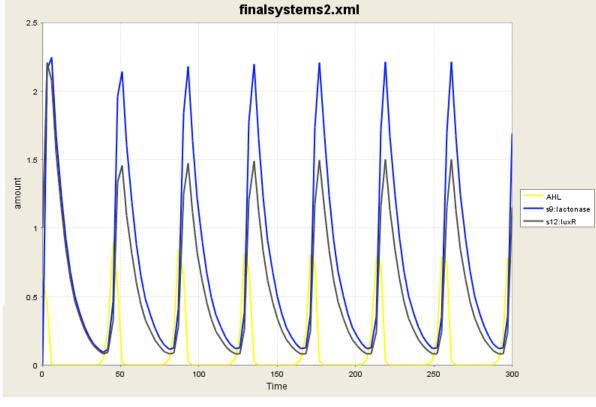


Fig.6b: Output from the model in Fig.6a:

We are getting oscillations !!!

 To gain some qualitative insight we will initially work under the rapid equilibrium approximation. This approximation assumes that that the timescale of protein-protein and protein-DNA interactions are significantly faster than the other chemical reactions and thus we can consider these protein reactions to be at equilibrium