

# Population-level control of heterologous protein production in bacteria



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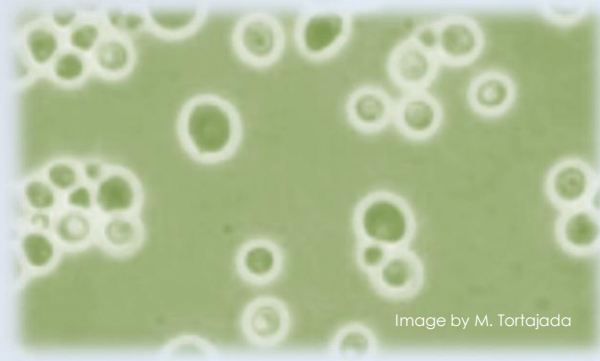
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Imperial College  
London

CSYNBI  
Centre for Synthetic Biology and Innovation

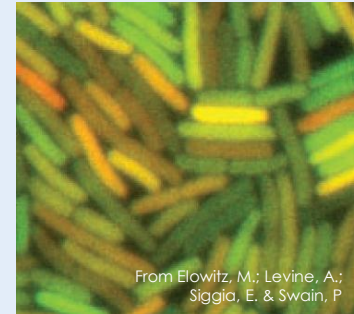
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If we want to ...



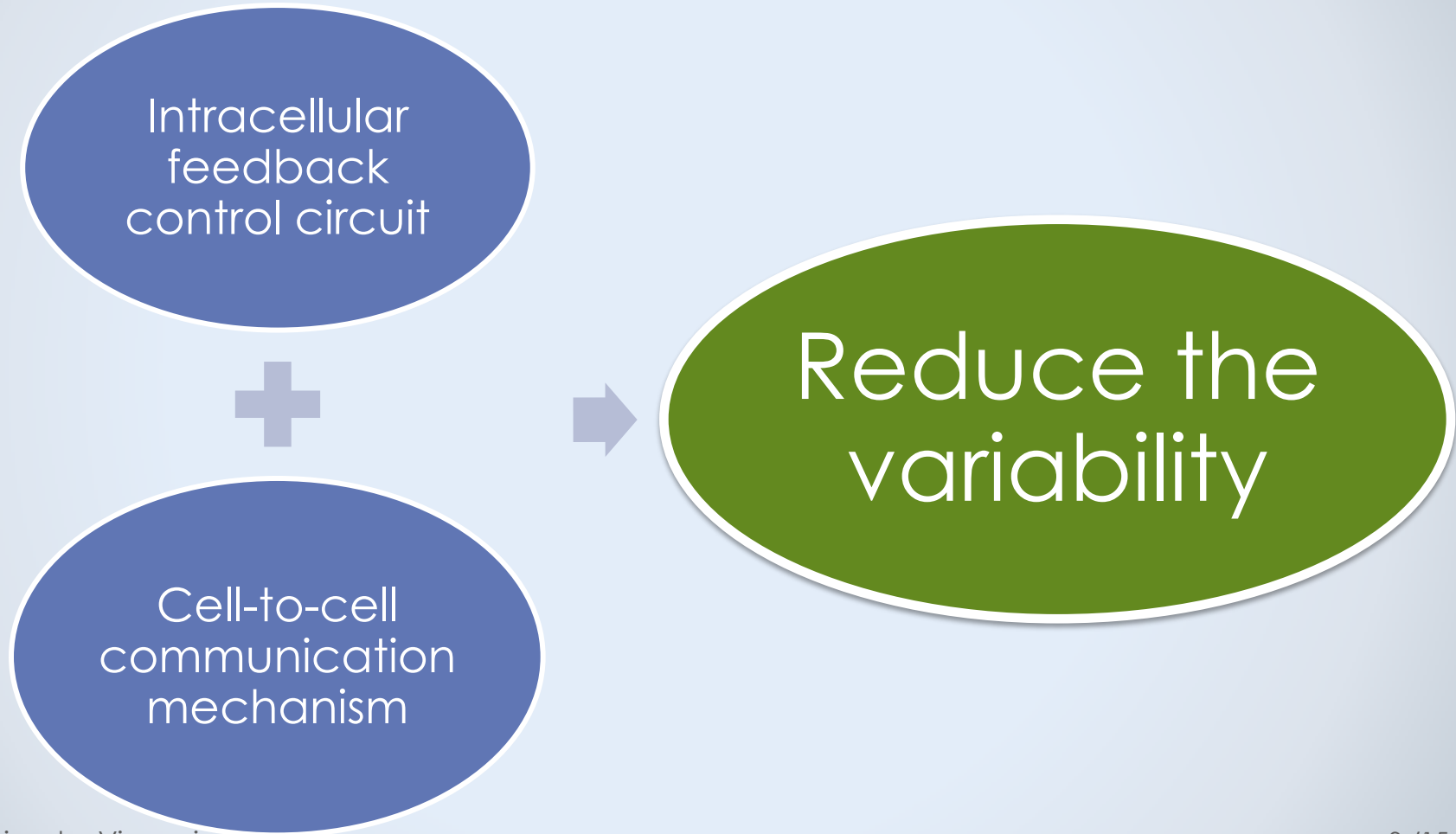
We have to fight with ...

Variability in  
gene expression.

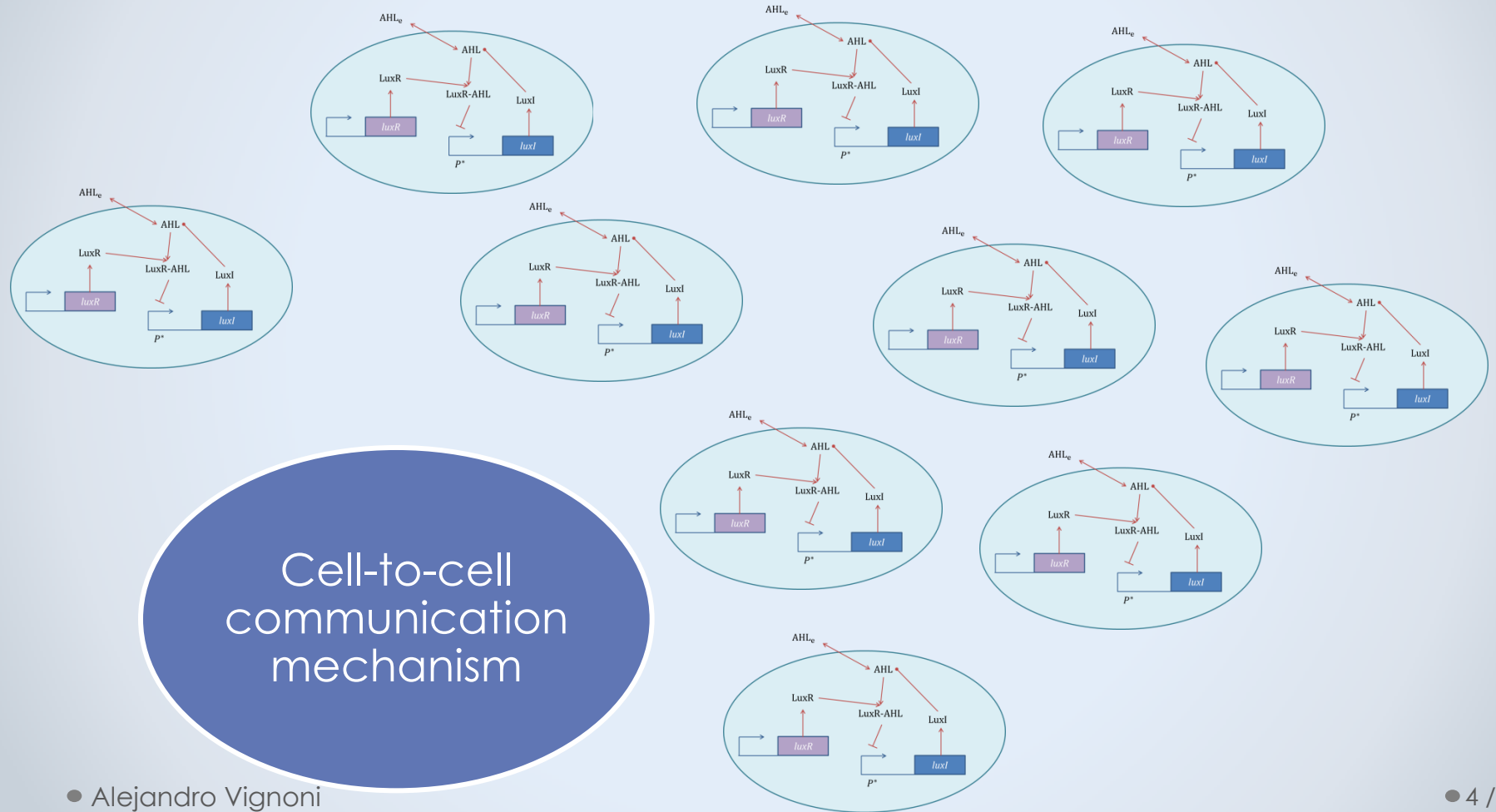


How?

# Using a synthetic gene network

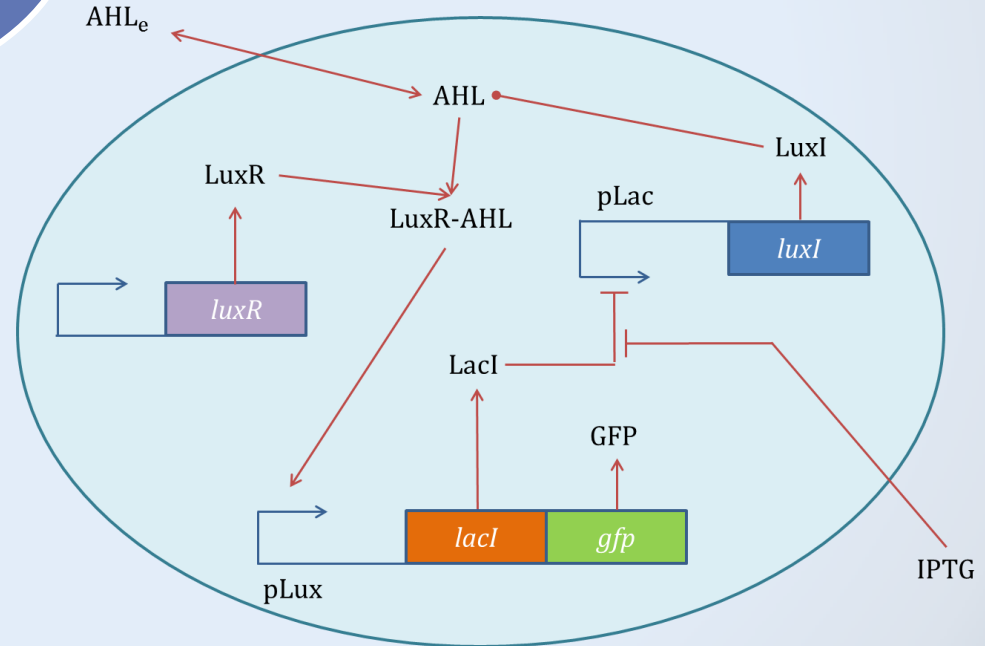


# Using a synthetic gene network

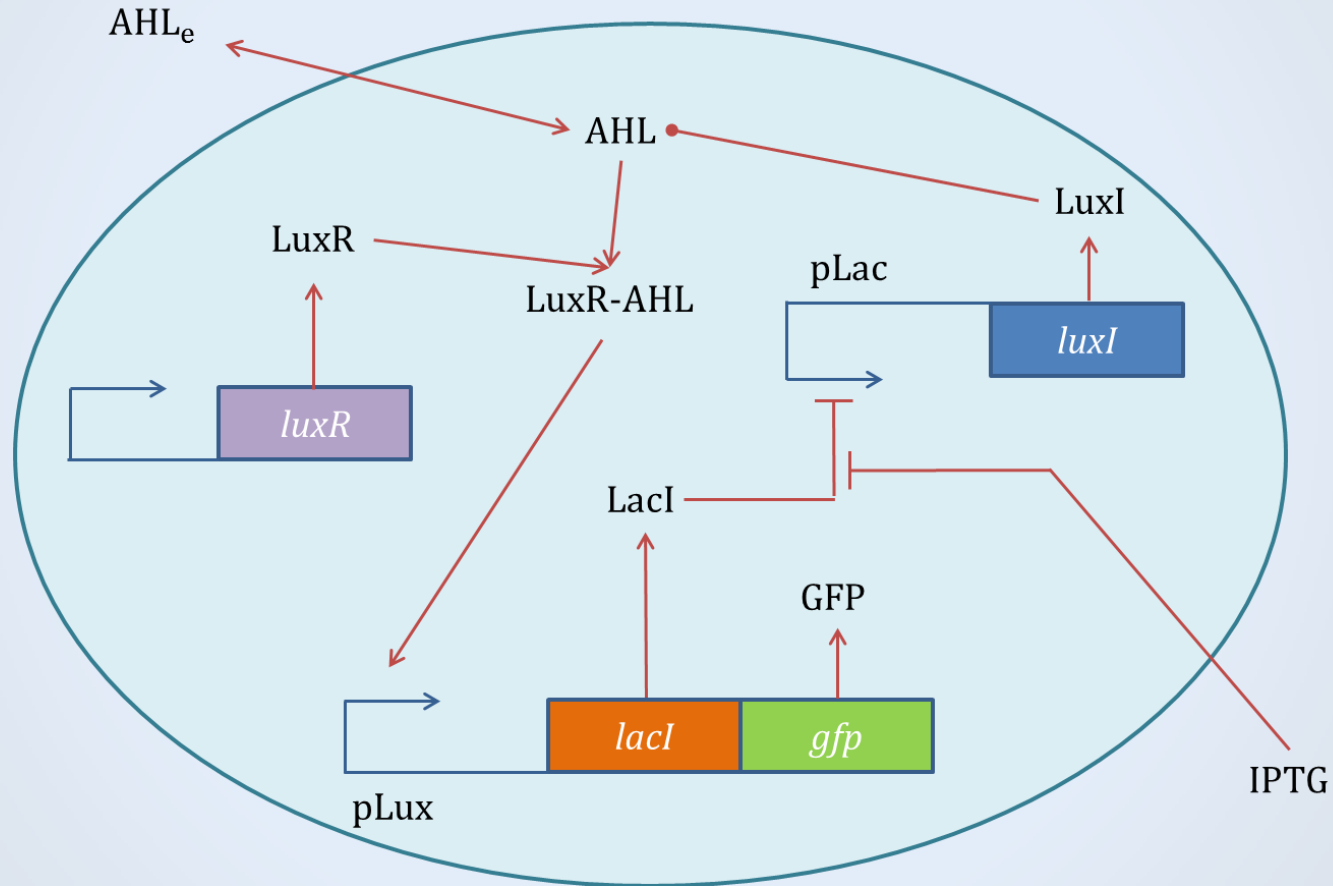


# Using a synthetic gene network

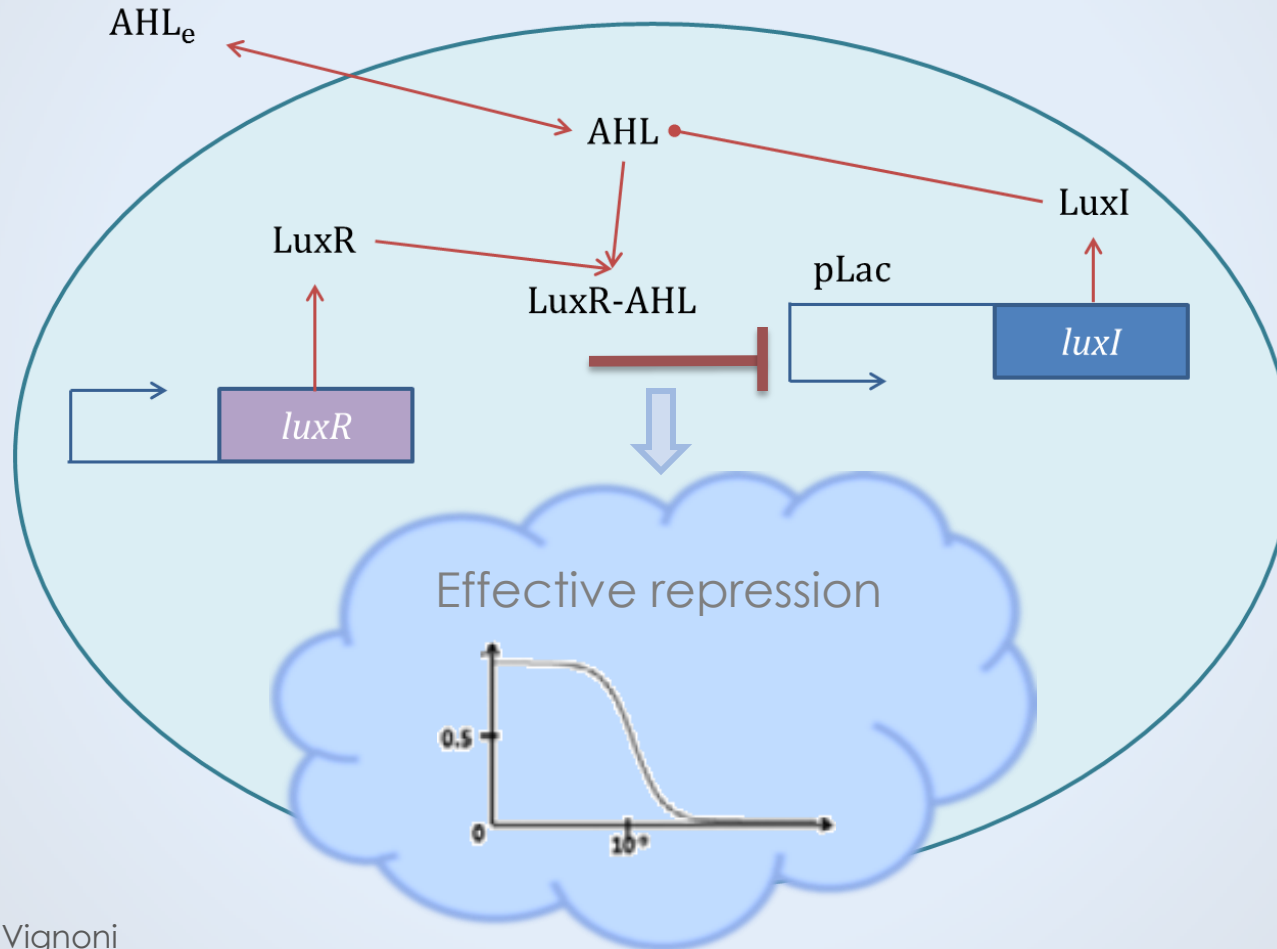
Intracellular  
feedback  
control circuit



# Genetic circuit

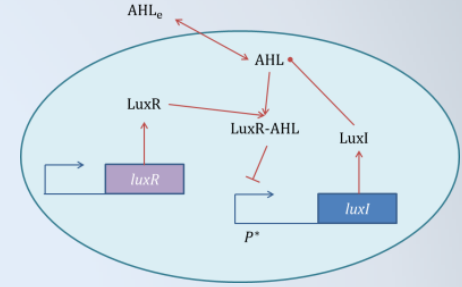


# Genetic circuit – Mathematical model



# Let's see the **model** of our genetic circuit.

$$Cell_i: \begin{cases} \frac{d[LuxI]_i}{dt} = b_i + u([AHL]_i) - \gamma_I [LuxI]_i \\ \frac{d[AHL]_i}{dt} = K_A [LuxI]_i + d([AHL]_i - [AHL]_e) - \gamma_A [AHL]_i \end{cases}$$



$b_i$  → Basal expression of *LuxI*

$K_A$  → AHL synthesis rate.

$u([AHL]_i)$  → effective repressor hill function

$d$  → Membrane permeability

$\gamma_I$  → *LuxI* degradation rate

$\gamma_A$  → AHL degradation rate

*External AHL dynamic*

$$\frac{d[AHL]_e}{dt} = \frac{d_e}{N} \sum_i^N ([AHL]_i - [AHL]_e) - \gamma_{Ae} [AHL]_e$$

$K_A$  → AHL synthesis rate.

$\gamma_{Ae}$  → External AHL decay rate

$d_e$  → External membrane permeability

$N$  → Number of cells



# The effective Hill function: the key element of the model

$$u([AHL]_i)_{hill} = \frac{K_I / K_h^\eta}{1 + ([AHL]_i / K_h)^\eta}$$

$\eta$  Hill coefficient

$K_h$  Half concentration constant

$K_I$  Dynamic range

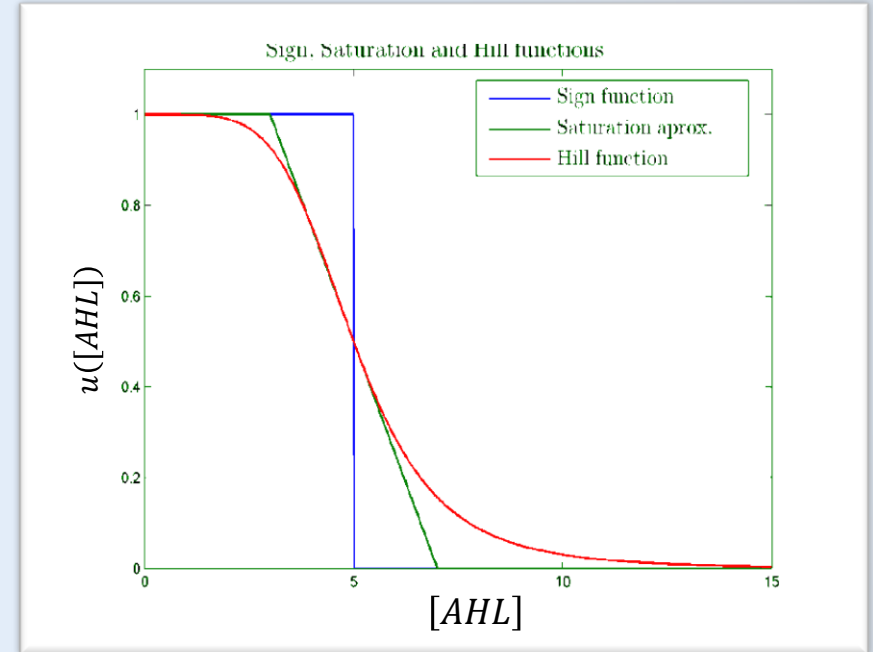


*Control Parameters*

**S** Slope

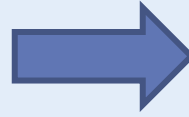
**T** Threshold

**R** Range



*For analytical purposes:  
Saturation Approximation.*

Theoretical analysis  
and  
mathematical model



$$\text{Var}\{[AHL]\} = f_V(S, T)$$

$$\text{E}\{[AHL]\} = f_E(S, T, R)$$

Mean and variance  
can be controlled  
independently

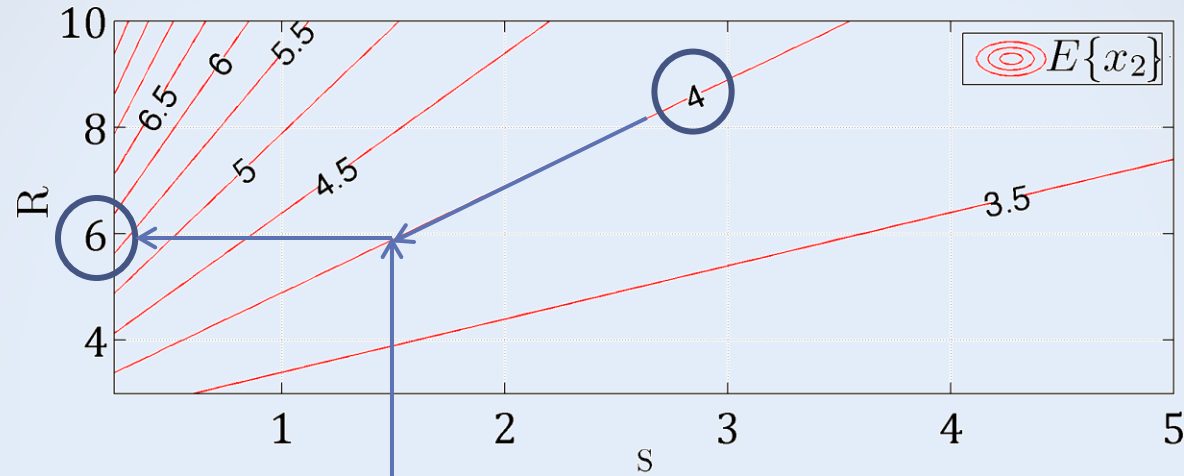
We will select the genetic regulation control parameters.



To obtain the desired gene expression variability distribution.

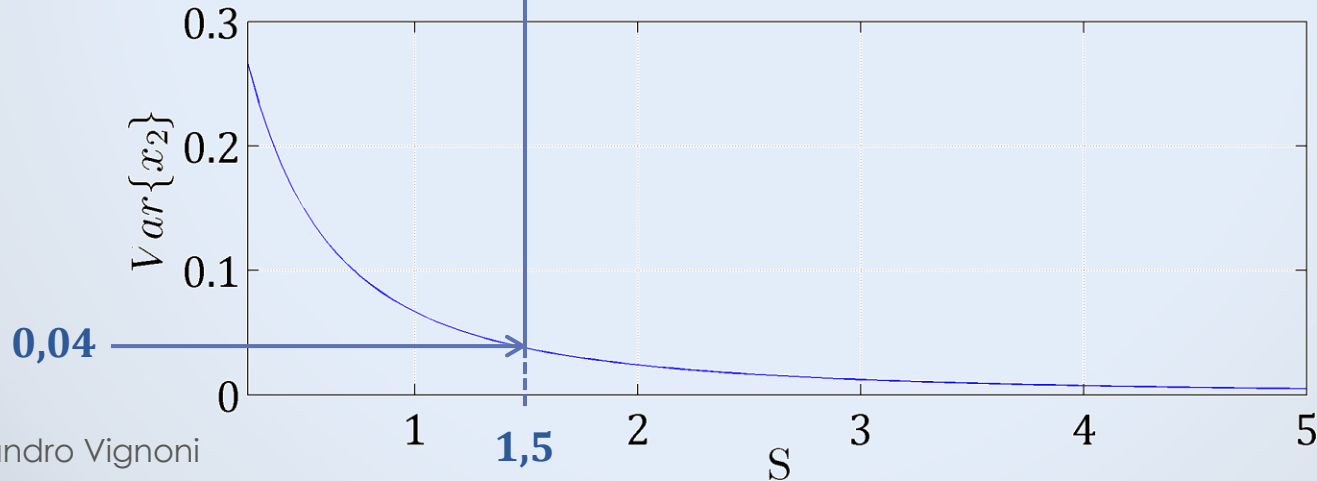
# We obtain a R-S chart for the Mean and the Variance

R-S chart of  $x_2$  mean and variance



If we want  
Mean: 4  
Variance: 0,04

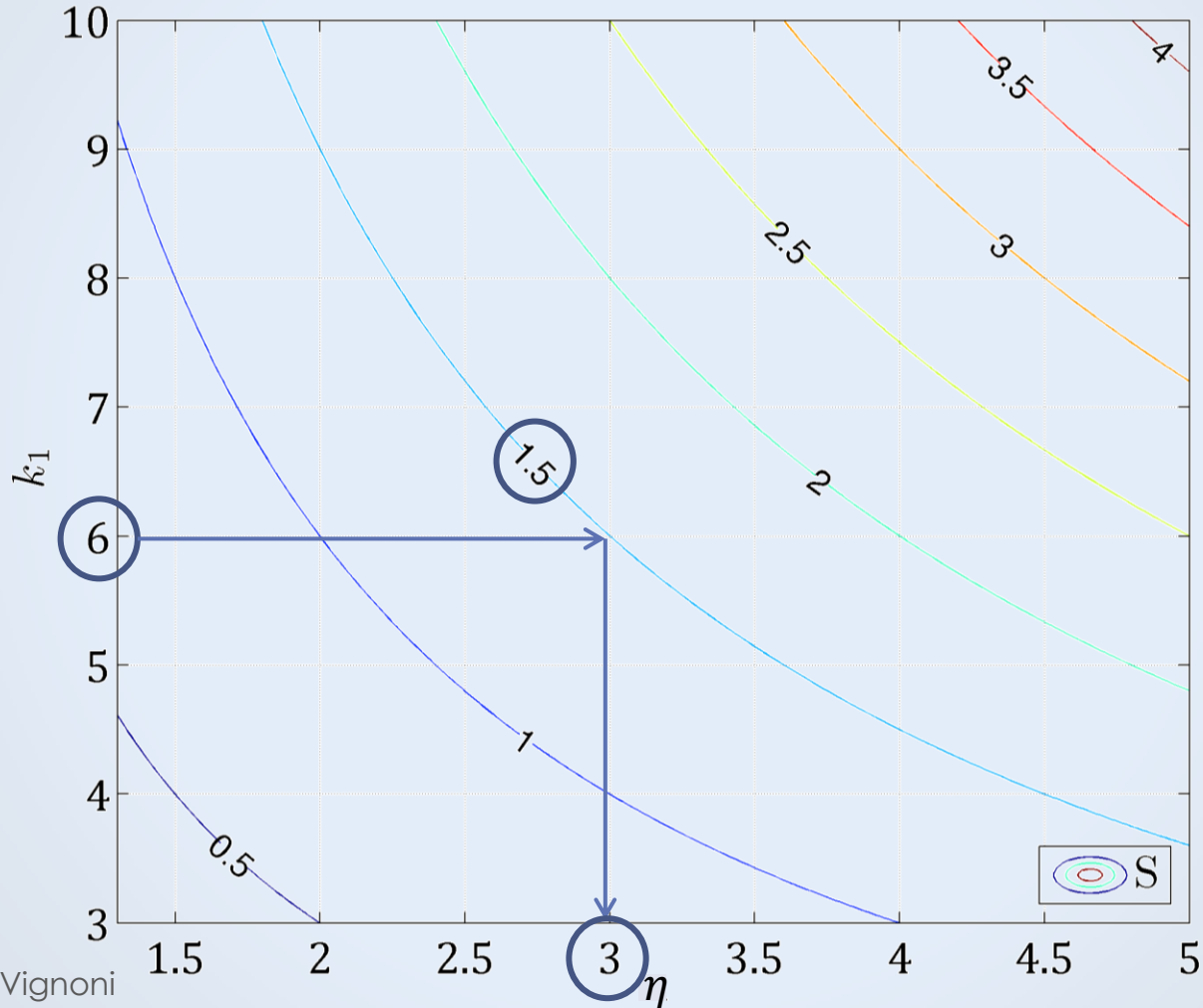
For a fixed  $T$



# Chart of control parameters

From the previous chart

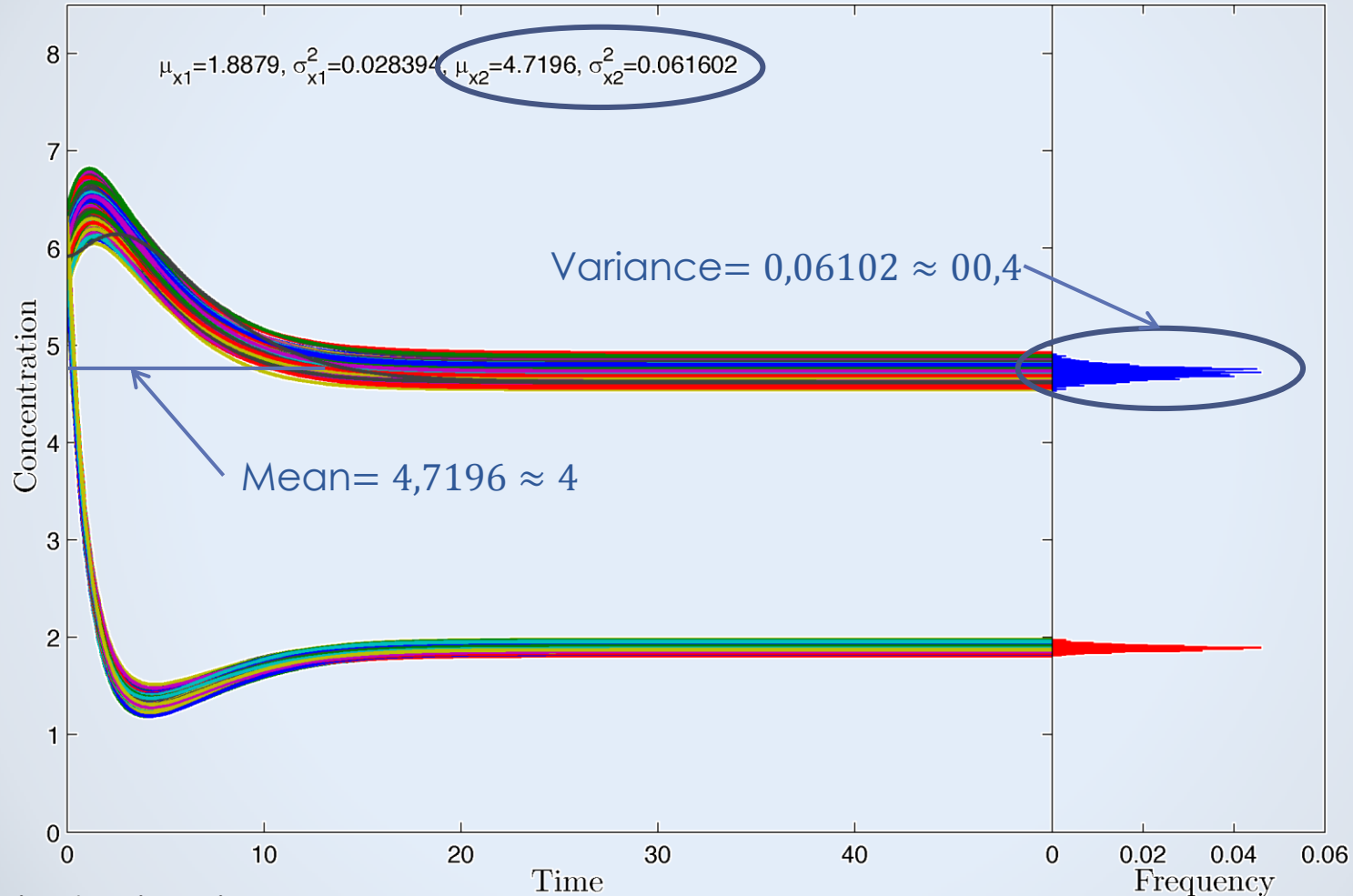
- $R=k_1=6$
- $S=1,5$



We obtain

- $k_1=6$
- $\eta=3$

We perform a *simulation experiment* introducing more stochasticity



# Summary

- **Control** of the *mean* and the *variance* of the gene expression noise *can be done*.
- Parameters chart to help the design
- Simulation experiments
- Synthetic biology potential for industrial applications.

## Future work

- Improve the model
- Make Experiments: Which parameters can we tune ?

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