

# The Feed-Forward Loop Network Motif

2IF35 Formal Modelling in Cell Biology

Technische Universiteit Eindhoven

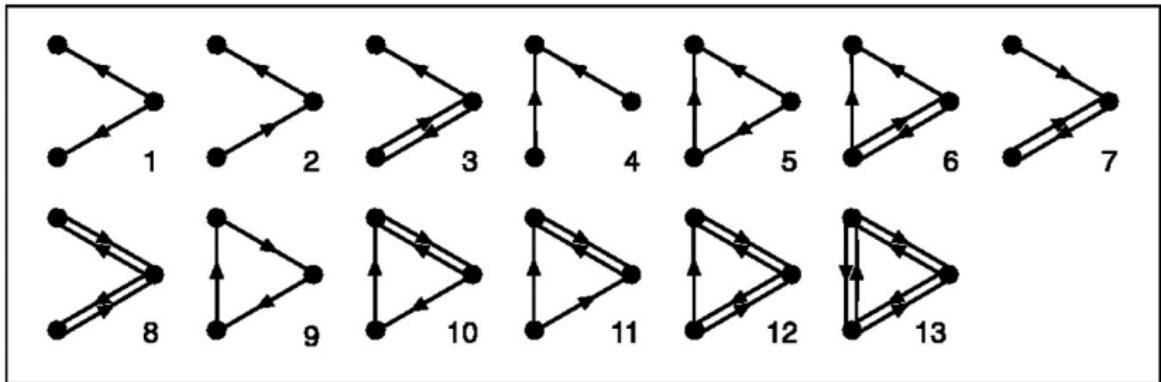
November 20, 2012

## feed forward loops



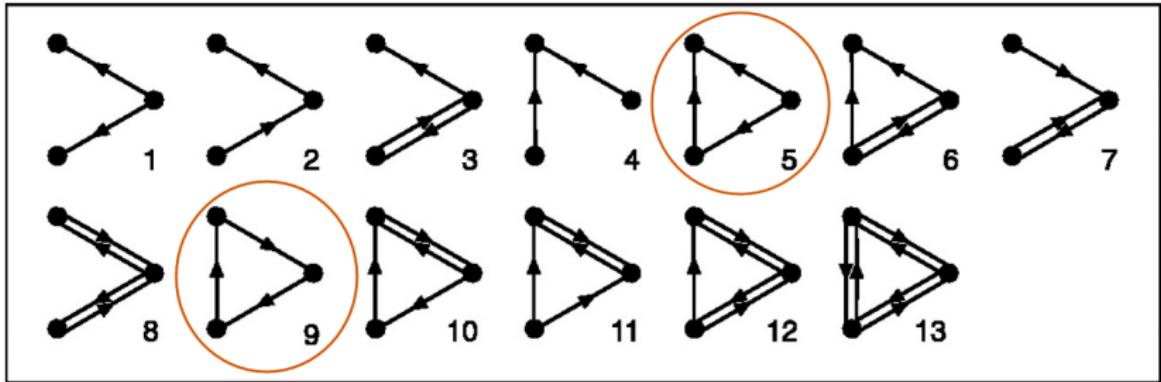
feed-forward loops in *E. coli* transcription network

## connected 3-node graphs



all 13 connected 3-node graphs

## connected 3-node graphs



feed-forward loop (nr. 5) and feedback loop (nr. 9)

## real vs. random graphs

graph  $G$  of  $N$  nodes and  $E$  edges

subgraph  $g$  of  $n$  nodes and  $e$  edges with  $s$  symmetries

probability for specific edge  $p = E/N^2$

expected subgraph frequency  $[N_g] \approx \frac{1}{s} N^n p^e$

## mean connectivity $\lambda$

mean connectivity  $\lambda = E/N$

thus  $p = \lambda/N$  and  $[N_g] \approx \frac{1}{s} N^{n-e} \lambda^e$

scaling relation  $[N_g] \sim N^{n-e}$  (fixed  $\lambda$ )

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$$\text{V-shape} \quad 3 - 2 = 1 \quad [N_g] \sim N$$

$$\text{full 3-clique} \quad 3 - 6 = -3 \quad [N_g] \sim N^{-3}$$

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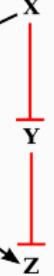
constant expectations

$$[N_{FFL}] = \frac{1}{1} \lambda^3 N^0 = \lambda^3 \text{ and } [N_{3loop}] = \frac{1}{3} \lambda^3 N^0 = \lambda^3$$

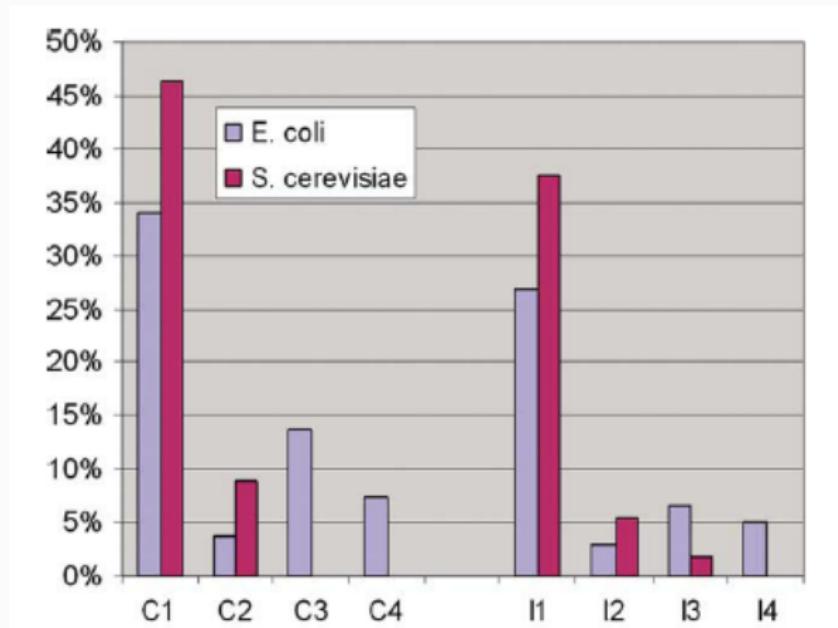
# FFL is a network motif

	Feed-Forward Loop	Feedback Loop
<i>E. coli</i>	42	0
Erdös-Reyni random	$1.7 \pm 1.3$ (Z=31)	$0.6 \pm 0.8$
degree-preserving random	$7 \pm 5$ (Z=7)	$0.2 \pm 0.6$

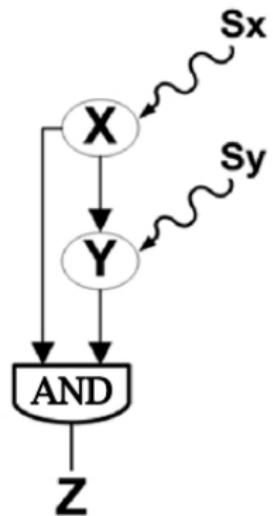
# coherent and incoherent feed-forward loops

coherent FFL	C1-FFL	C2-FFL	C3-FFL	C4-FFL
				
incoherent FFL	I1-FFL	I2-FFL	I3-FFL	I4-FFL
				

## relative frequency of FFL types

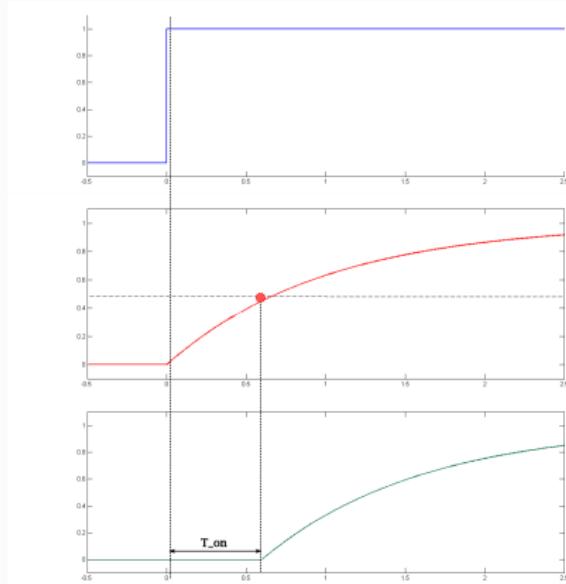


# integration of activation/inhibition



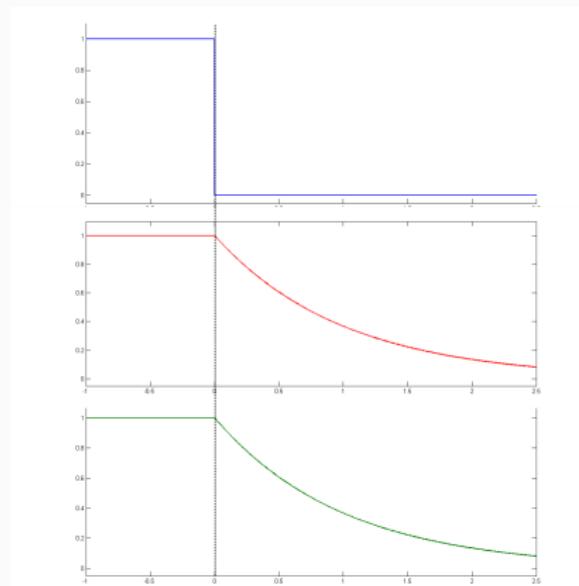
C1-FFL with AND logic

# C1-FFL as sign-sensitive delay element



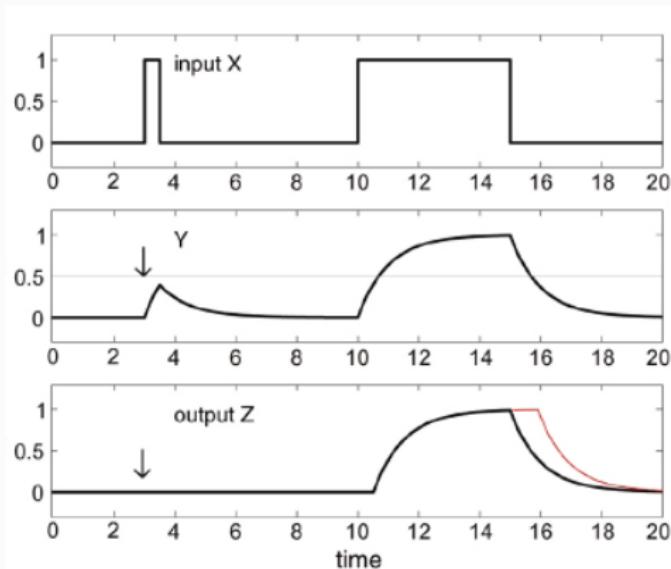
$$\frac{dY}{dt} = \beta_Y \theta(X^* > K_{XY}) - \alpha_Y Y \quad \text{and} \quad \frac{dZ}{dt} = \beta_Z \theta(X^* > K_{XZ}) \theta(Y^* > K_{YZ}) - \alpha_Z Z$$

# C1-FFL as sign-sensitive delay element (cont.)



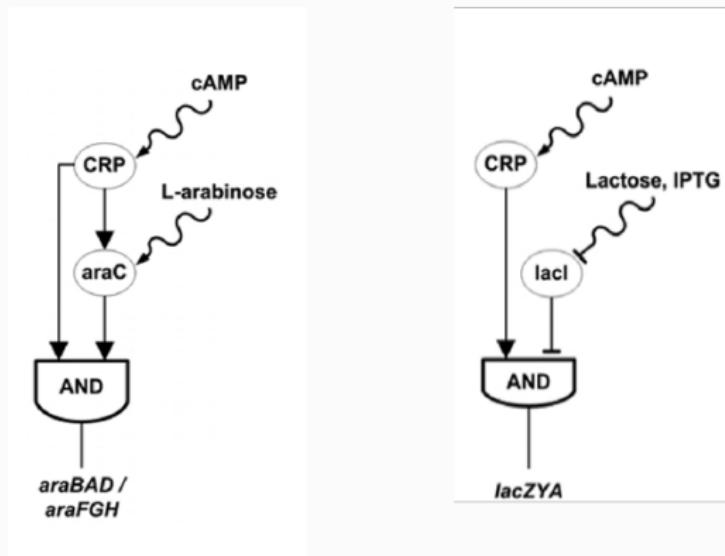
dynamics of C1-FFL following an OFF step

## C1-FFL as sign-sensitive delay element (cont.)



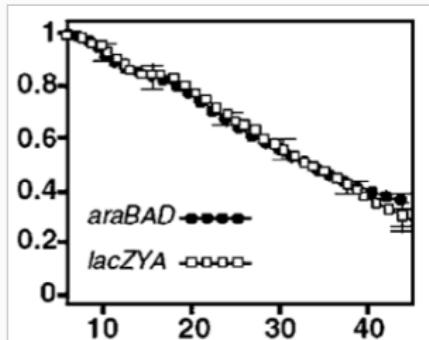
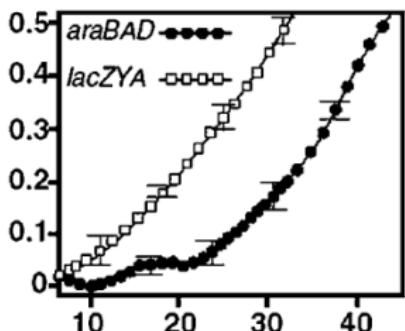
persistence detector: protection against brief input fluctuations

# sign-sensitive delay in the arabinose system



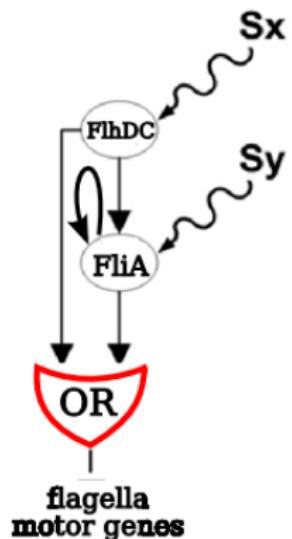
C1-FFL compared to simple regulation

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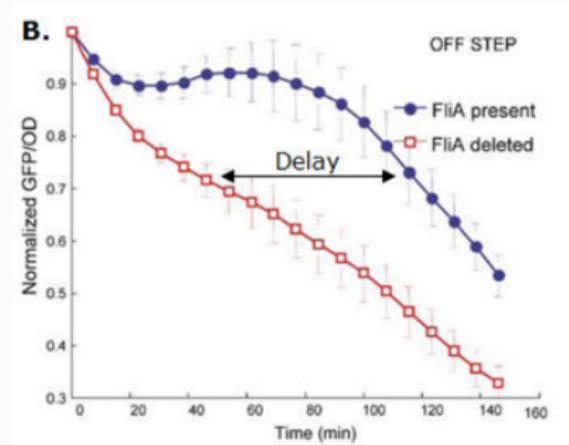
C1-FFL compared to simple regulation

# C1-FFL with OR logic



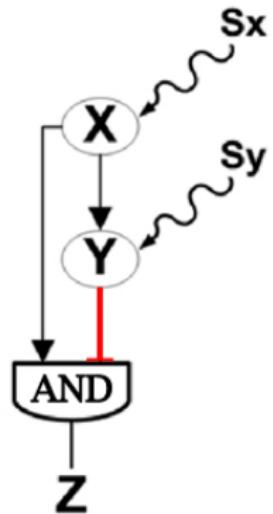
sign-sensitive delay for OFF steps

# C1-FFL with OR logic



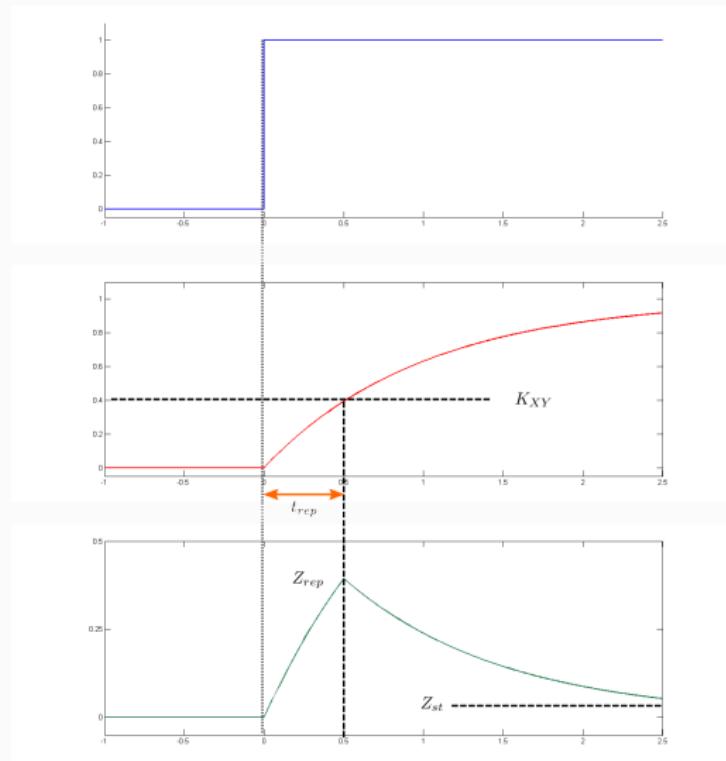
sign-sensitive delay for OFF steps

## type-1 incoherent FFL



two parallel antagonistic paths

# type-1 incoherent FFL (cont.)



dynamics of I1-FFL

## type-1 incoherent FFL (cont.)

production of  $Y$

$$\frac{dY}{dt} = \beta_Y - \alpha_Y Y$$

$$Y(t) = Y_{st}(1 - e^{-\alpha_Y t}) \quad Y_{st} = \frac{\beta_Y}{\alpha_Y}$$

production of  $Z$  while  $Y < K_{XY}$

$$\frac{dZ}{dt} = \beta_Z - \alpha_Z Z$$

$$Z(t) = Z_m(1 - e^{-\alpha_Z t}) \quad Z_m = \frac{\beta_Z}{\alpha_Z}$$

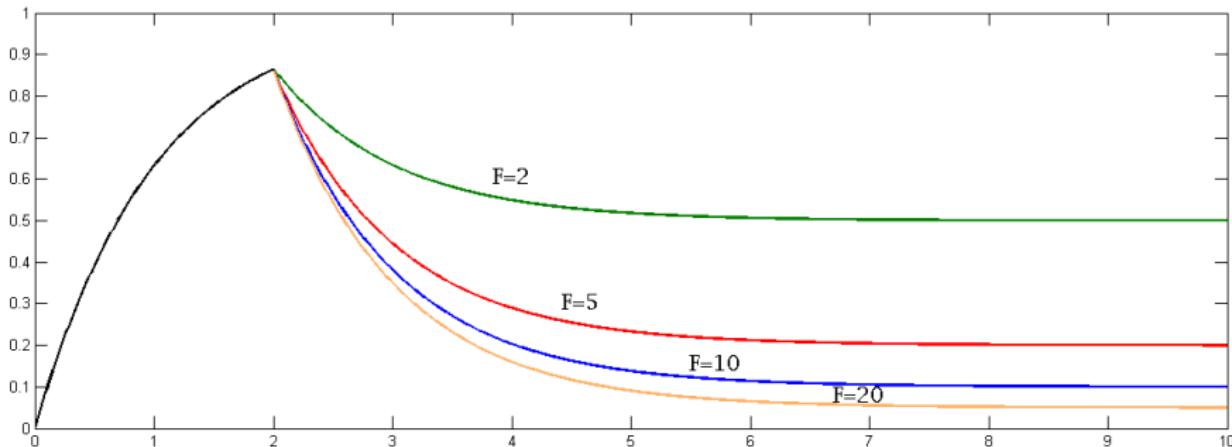
production of  $Z$  once  $Y \geq K_{XY}$

$$\frac{dZ}{dt} = \beta'_Z - \alpha_Z Z$$

$$Z(t_{rep}) = Z_{rep} \quad Y(t_{rep}) = K_{YX} \quad Z_{st} = \frac{\beta'_Z}{\alpha_Z}$$

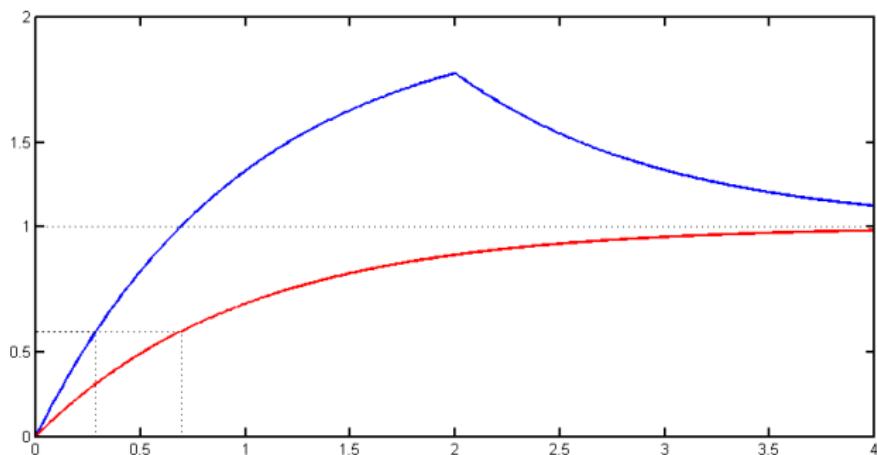
$$Z(t) = Z_{st} + (Z_{rep} - Z_{st})e^{-\alpha_Z(t-t_{rep})}$$

# I1-FFL as pulse generator



repression factor  $F = \frac{\beta_Z}{\beta'_Z}$

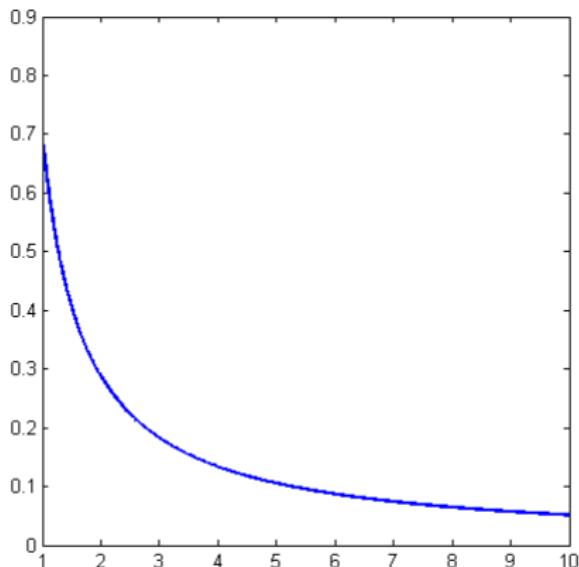
# I1-FFL shortens response time



I1-FFL vs. simple regulation

speed-up of initial reduction with equal steady state value

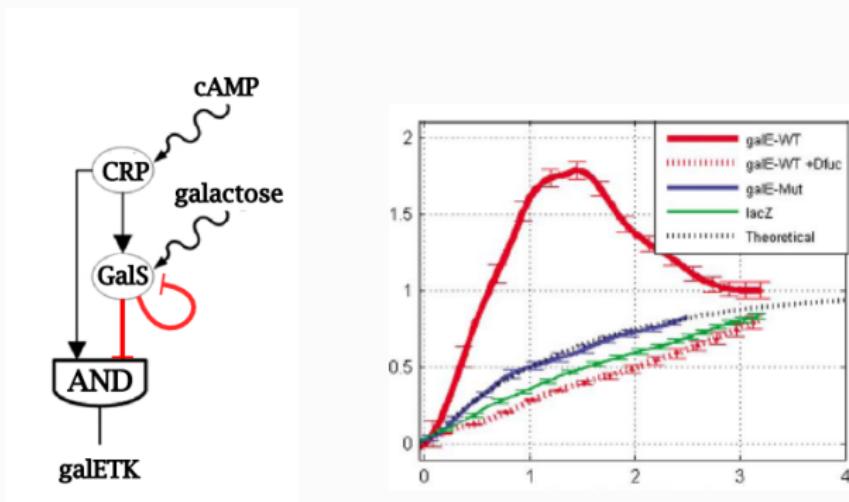
## I1-FFL shortens response time (cont.)



response time  $T_{1/2}$  vs. repression factor  $F$

solving  $\frac{\beta_Z}{\alpha_Z} \left(1 - e^{-\alpha_Z T_{1/2}}\right) = \frac{1}{2} \frac{\beta'_Z}{\alpha_Z}$  yields  $T_{1/2} = \log(\frac{2F}{2F-1})$

# experimental I1-FFL study



I1-FFL dynamics in *E. coli* galactose system