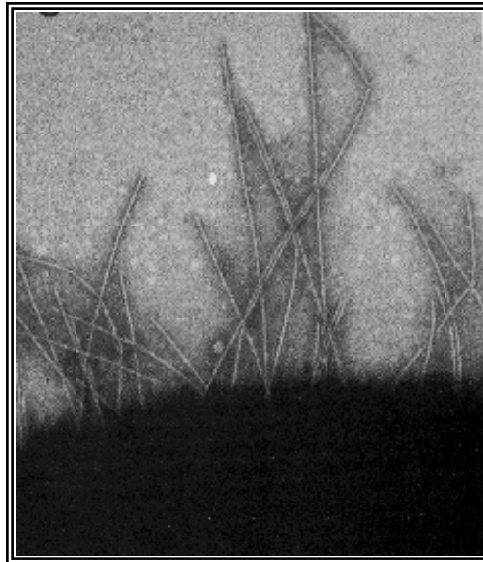
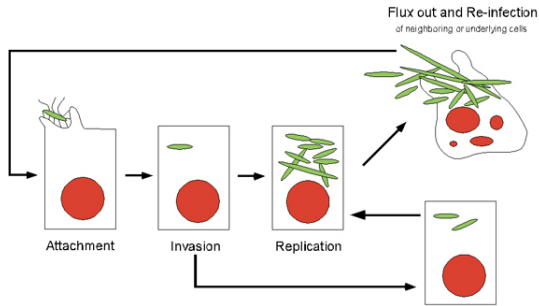


Control of the Pathogenic *fim* Switch in *E. coli*

Denise Wolf and Adam Arkin

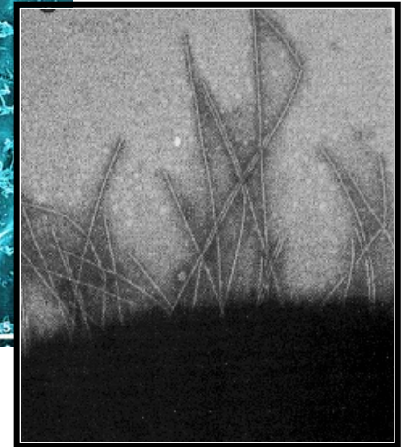
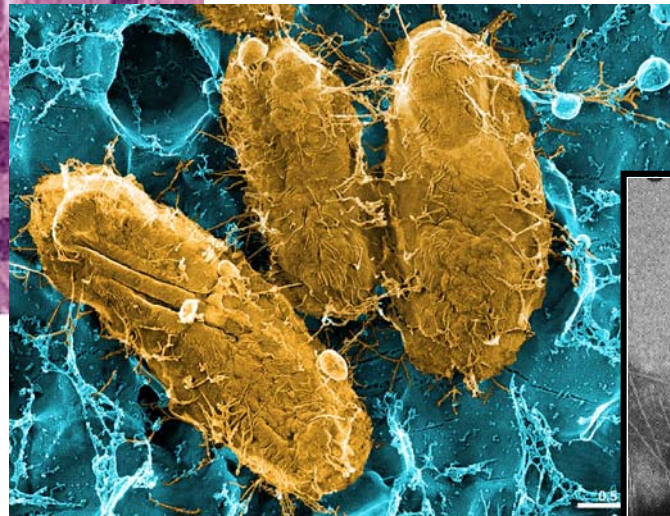
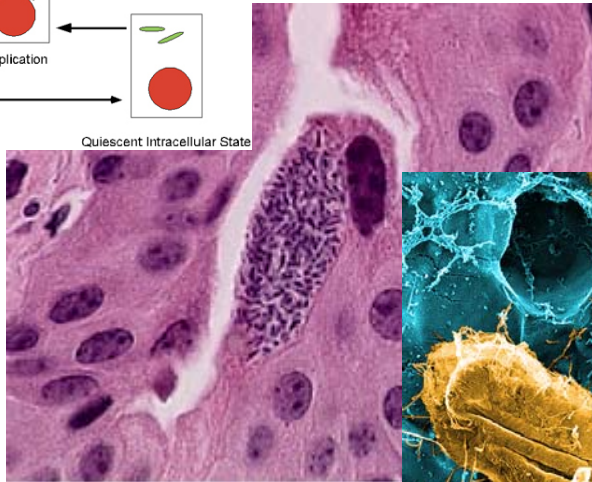


Molecular Control of Infection Dynamics



- 30% of women will have at least one urinary tract infection during their life
- Urinary Tract Infection (UTI) accounts over 7 million office visits per year

- 25% recurrence rate- 85% are caused by the initial strain.
- 80% caused by uropathic *Escherichia coli*



Host defenses: micturition, exfoliation, anti-microbials, neutrophil influx, 2nd, 3rd waves of immune system.

Type-1 pili virulence factors, enabling (1) adhesion, and (2) invasion

Type-1 Pili

•Benefits

- Avoid being washed away (*adherence*)
- Opportunities for rapid replication (*invasion, factory mode*)
- Opportunities for recurrence (*invasion, quiescent mode*)

•Costs

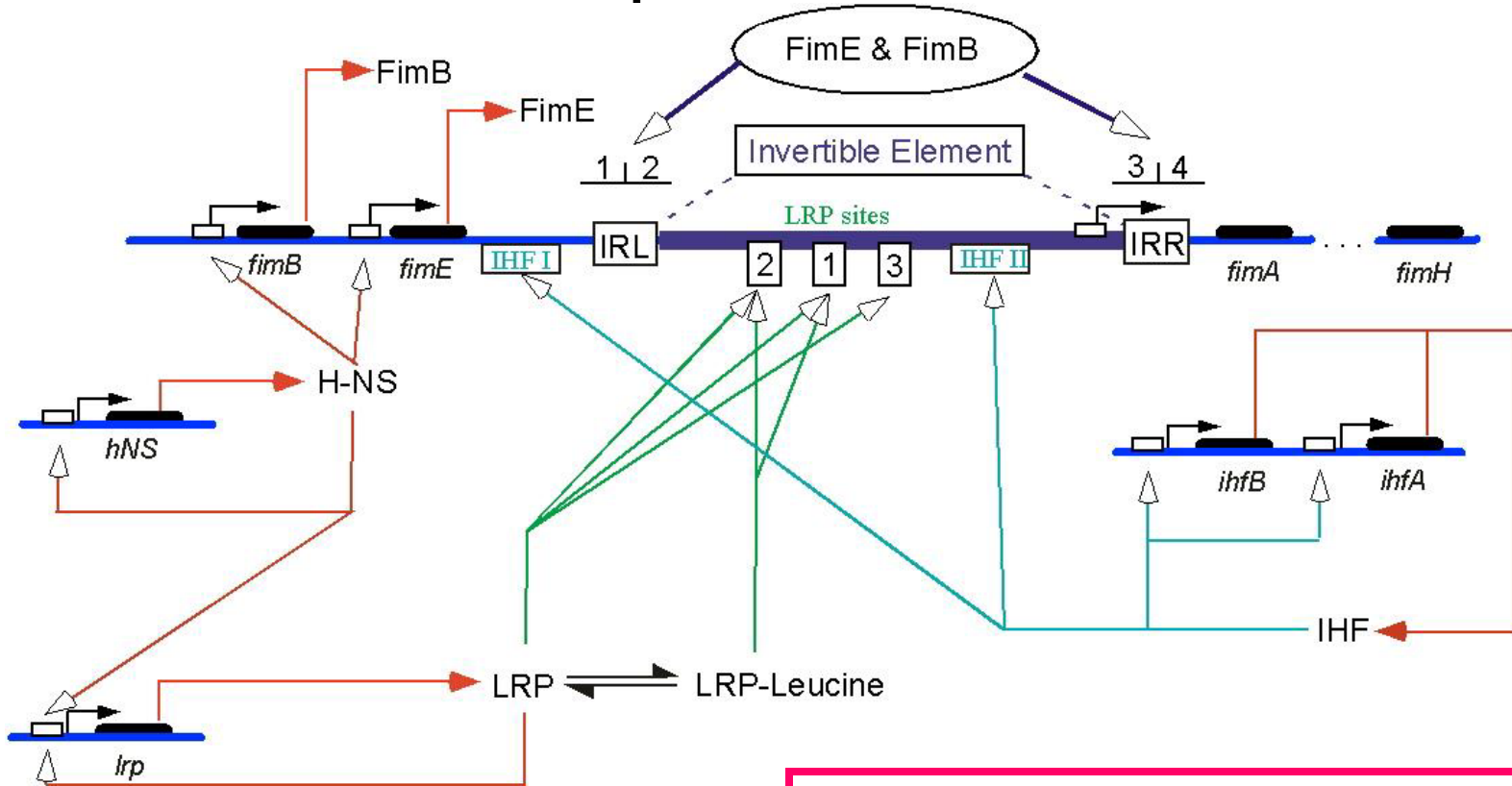
- Activation of immune system, rapid clearance of infection
- Detract from survival outside host – agglutination, lack of good target
- Energy requirements



•*fim* control circuit balances conflicting demands for survival

- Heterogenous, two-state population, stochastic phase variation
- Switching rate, piliation level, attachment, detachment, growth rates adapt s.t.
 - Persistent infection
 - Avoidance of neutrophil spike
 - Quiescent pockets for recurrence
 - Locally responsive to state of environment, host, disease process phase

Genetic Make-Up of the Fimbriation Switch



- Invertible element, 314 bp, w/*fimA* promoter
- **Recombinases** *FimB*, *FimE*;
 FimE w/ marked ON-to-OFF preference
- IHF - necessary for switching (+)
- Lrp - greatly accelerate switching (+)
- H-NS - repressor, Temp dep [], activity (-)
- *fimE* orientational control

This compact integrated circuit can

- Mediate the % of cells that have pili.
- Control the rate at which a population changes piliation state
- Sense the temperature of the host to mediate switching
- Sense the amount of nutrient in the medium.

System-level Questions

How does network architecture accomplish phase variation control?

- **Basic switch operation:**

How does circuit sense the environment and control piliation level, attachment, detachment, invasion rates to balance demands of infection?

- *Design questions:*

- Why *two* independent recombinases?

- Source of ON-to-OFF *specificity of FimE?*
(hypothesized binding affinities, orient control)

- Role of *orientational control* of *fimE*?

- How is temperature control achieved?
(*tuned to mammalian body temperature*)

Regulatory motifs?

Mathematical model

Invertible element

Master equation form

$$\frac{dP_{on}}{dt} = f(1 - P_{on}) - gP_{on} \quad (1)$$

Equilibrium statistical thermodynamics for f, g

with

$$f = \frac{\sum_{s \in OFF} \alpha_s e^{-\Delta G_s / RT} [IHF]^{n(s)} [FimE]^{j(s)} [FimB]^{k(s)} [Lrp^*]^{m(s)} [Lrp]^{l(s)}}{1 + \sum_{s \in OFF} e^{-\Delta G_s / RT} [IHF]^{n(s)} [FimE]^{j(s)} [FimB]^{k(s)} [Lrp^*]^{m(s)} [Lrp]^{l(s)}}$$

and

$$g = \frac{\sum_{s \in ON} \alpha_s e^{-\Delta G_s / RT} [IHF]^{n(s)} [FimE]^{j(s)} [FimB]^{k(s)} [Lrp^*]^{m(s)} [Lrp]^{l(s)}}{1 + \sum_{s \in ON} e^{-\Delta G_s / RT} [IHF]^{n(s)} [FimE]^{j(s)} [FimB]^{k(s)} [Lrp^*]^{m(s)} [Lrp]^{l(s)}}$$

(1) : evolution of Pon, probability of piliation switch being ON. Assume: two state Markov process, regulatory protein binding/unbinding fast relative to switch rate. Consequence: Master eq form, stat thermo f and g.

State table for invertible element

IHF binding site

FimE/B binding site

Lrp binding sites

Free energies of binding

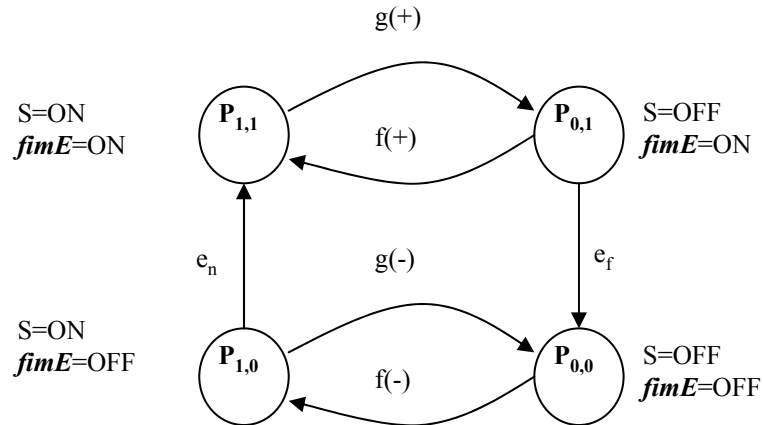
Switching rate

State	P_{IHF}	$P_{FimE/B}$	Lrp-A	Lrp-3	ΔG	α	n	j	k	m	l
1/9	-	-	-	-	0	0	0	0	0	0	0
2/10	IHF	-	-	-	$\Delta G_2/\Delta G_2$	0	1	0	0	0	0
3/11	IHF	FimE	-	-	$\Delta G_3/\Delta G_7$	α_1/α_4	1	0	1	0	0
4/12	IHF	FimB	-	-	$\Delta G_4/\Delta G_8$	α_2/α_3	1	1	0	0	0
5/13	IHF	FimE	Lrp*	-	$\Delta G_{31a}/\Delta G_{71a}$	$\alpha_{11a}/\alpha_{41a}$	1	0	1	4	0
6/14	IHF	FimE	Lrp*	Lrp	$\Delta G_{31b}/\Delta G_{71b}$	$\alpha_{11b}/\alpha_{41b}$	1	0	1	4	2
7/15	IHF	FimB	Lrp*	-	$\Delta G_{41a}/\Delta G_{81a}$	$\alpha_{21a}/\alpha_{31a}$	1	1	0	4	0
8/16	IHF	FimB	Lrp*	Lrp	$\Delta G_{41b}/\Delta G_{81b}$	$\alpha_{21b}/\alpha_{31b}$	1	1	0	4	2
17/27	-	FimE	-	-	$\Delta G_{33}/\Delta G_{77}$	0	0	0	1	0	0
18/28	-	FimB	-	-	$\Delta G_{44}/\Delta G_{88}$	0	0	1	0	0	0
19/29	-	FimE	Lrp*	-	$\Delta G_{331a}/\Delta G_{771a}$	0	0	0	1	0	0
20/30	-	FimE	Lrp*	Lrp	$\Delta G_{331b}/\Delta G_{771b}$	0	0	0	1	4	2
21/31	-	FimB	Lrp*	-	$\Delta G_{441a}/\Delta G_{881a}$	0	0	1	0	4	0
22/32	-	FimB	Lrp*	Lrp	$\Delta G_{441b}/\Delta G_{881b}$	0	0	1	0	4	2
23/33	-	-	Lrp*	-	$\Delta G_{33a}/\Delta G_{77a}$	0	0	0	0	4	0
24/34	-	-	Lrp*	Lrp	$\Delta G_{33a}/\Delta G_{77a}$	0	0	0	0	4	2
25/35	IHF	-	Lrp*	-	$\Delta G_{33b}/\Delta G_{77b}$	0	1	0	0	4	0
26/36	IHF	-	Lrp*	Lrp	$\Delta G_{33a}/\Delta G_{77a}$	0	1	0	0	4	2

e.g.,

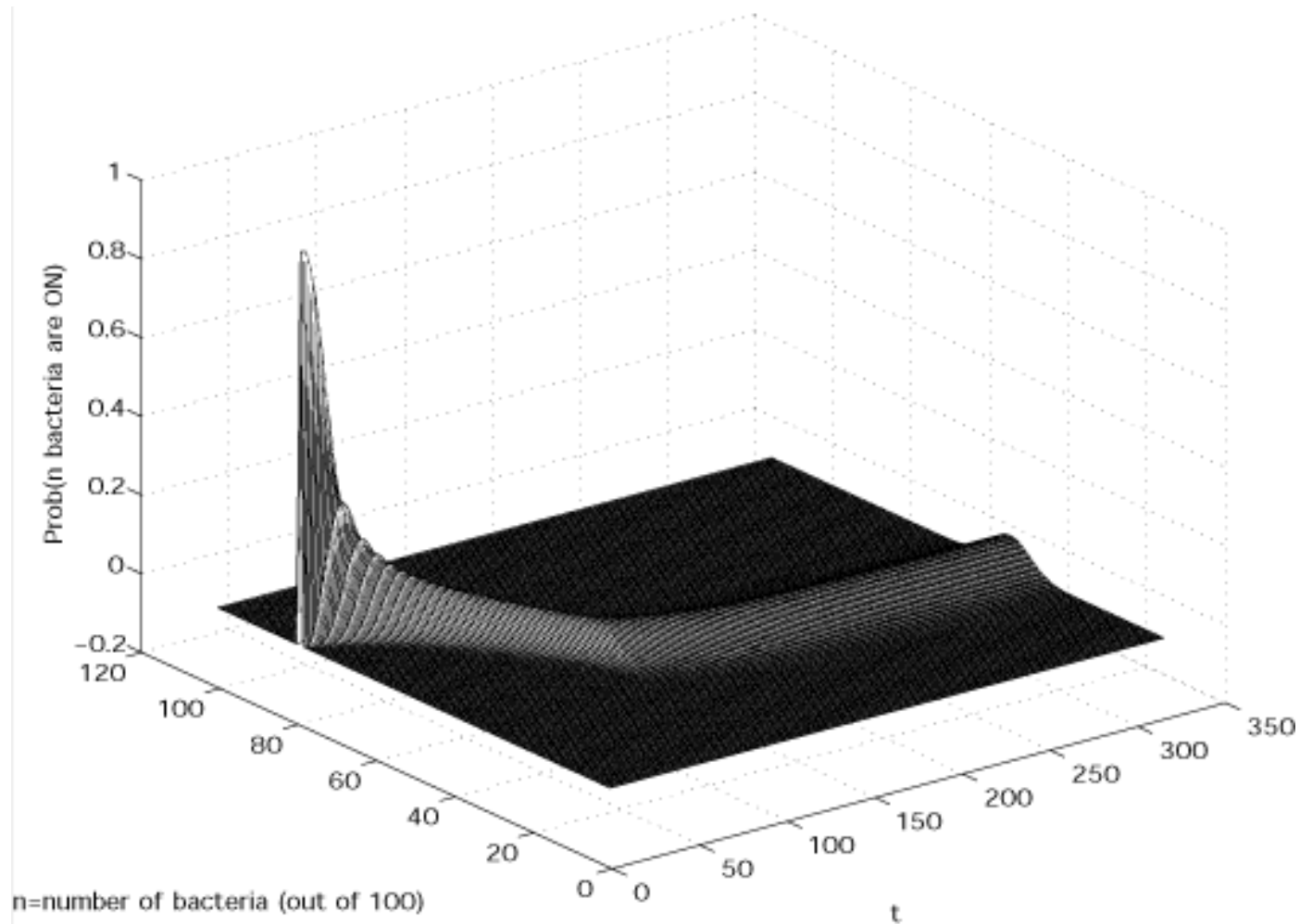
$$p(3) = \frac{e^{-\Delta G_3/RT} [IHF][FimE]}{1 + e^{-\Delta G_2/RT} [IHF] + e^{-\Delta G_3/RT} [IHF][FimE] + e^{-\Delta G_4/RT} [IHF][FimB] + e^{-\Delta G_{31a}/RT} [Lrp]^4 [IHF][FimE] \dots}$$

Complete phase variation network model (with *fimE* orientational control)



$$\frac{d}{dt} \begin{bmatrix} p_{1,1} \\ p_{0,1} \\ p_{0,0} \\ p_{1,0} \end{bmatrix} = \begin{bmatrix} -g(+), & f(+), & 0, & e_n \\ g(+), & -f(+)-e_f, & 0, & 0 \\ 0, & e_f, & -f(-), & g(-) \\ 0, & 0, & f(-), & -g(-)-e_n \end{bmatrix} \begin{bmatrix} P_{1,1} \\ P_{0,1} \\ P_{0,0} \\ P_{1,0} \end{bmatrix}$$

Single Cell Population

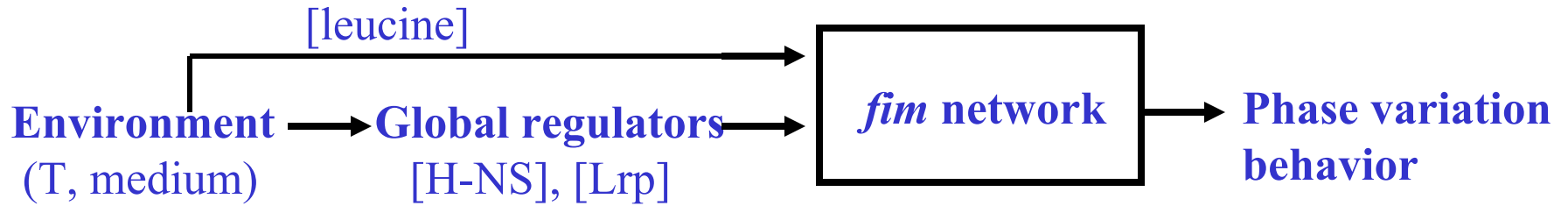


$$\text{mean ON} = NP_{\text{on}}(t)$$

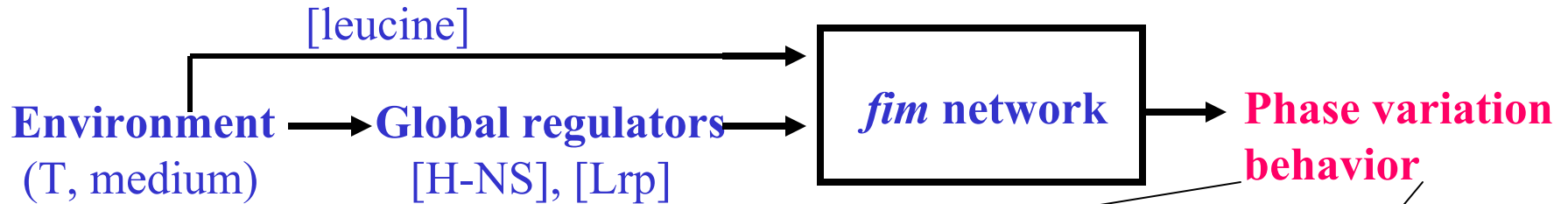
$$\text{standard dev.} = NP_{\text{on}}(t)(1 - P_{\text{on}}(t))$$

Results

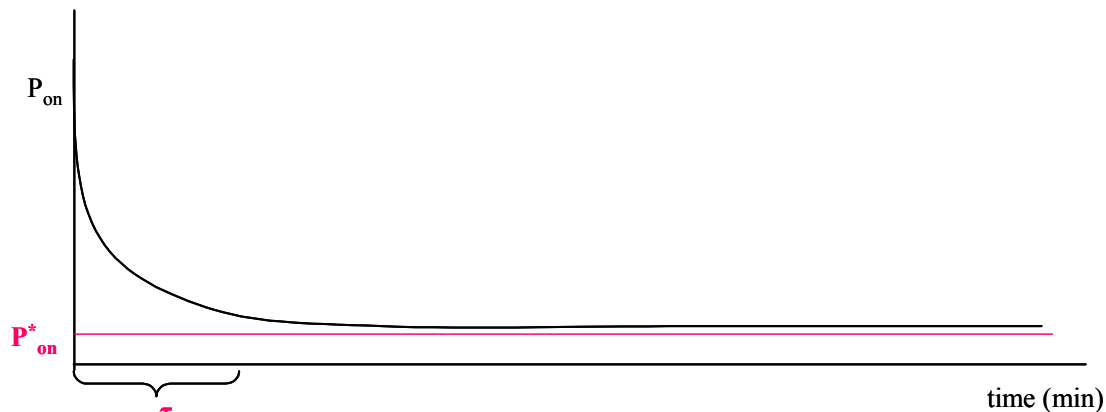
The *fim* network: from environment to behavior



The *fim* network: controllable behaviors



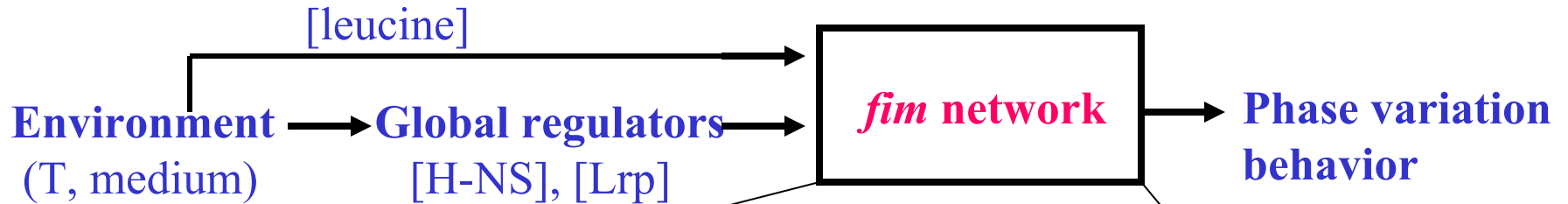
Population level control variables: P_{on}^ and τ*



- Steady state piliation level P_{on}^* (\propto attachment rate)
- Time constant τ , a measure of *speed* of response to ΔEnv

Cell level: switch-off distribution $p(t')$ (\propto detachment rate)

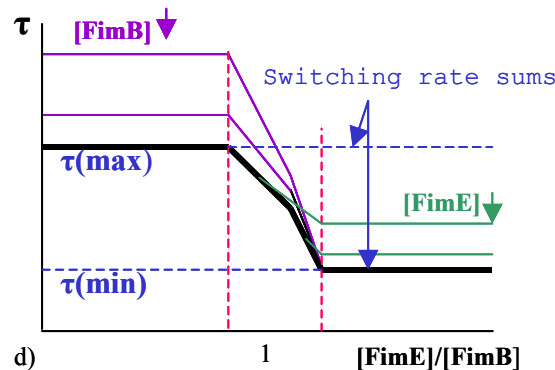
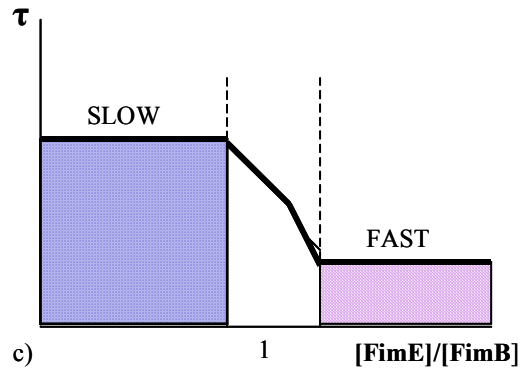
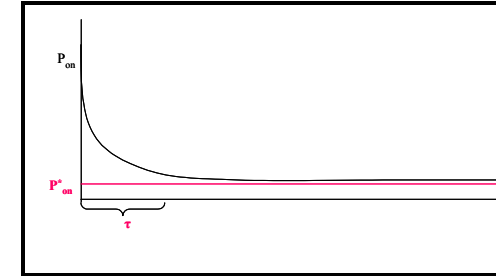
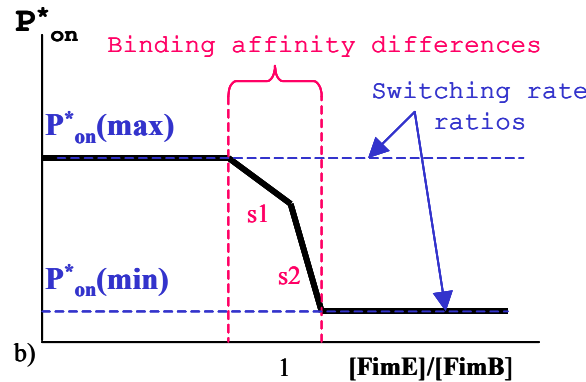
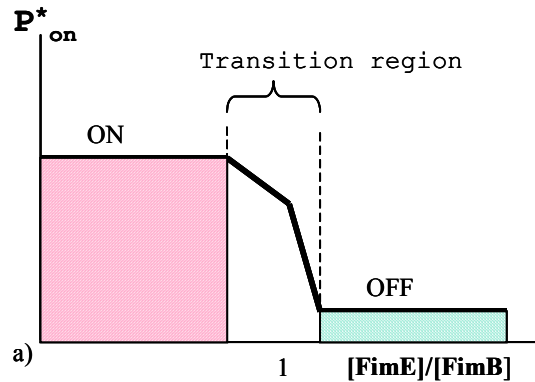
The *fim* network: primary mechanisms



1. *A recombinase ratio controlled switch*
2. *A temperature tuning motif*
3. *A time delay*

Mechanism 1: A recombinase ratio controlled switch

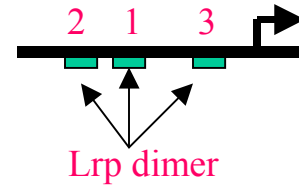
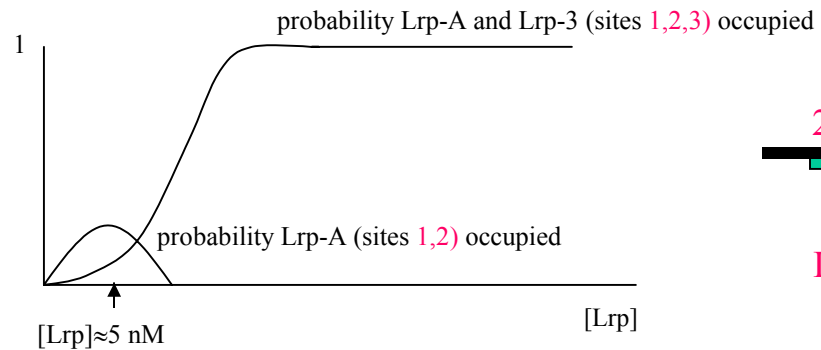
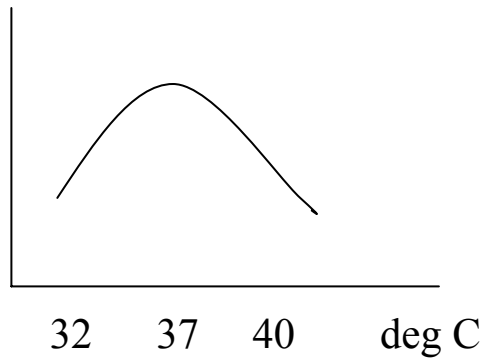
Environment \longrightarrow [H-NS] \longrightarrow [FimE]/[FimB] \longrightarrow ON or OFF, Fast or Slow



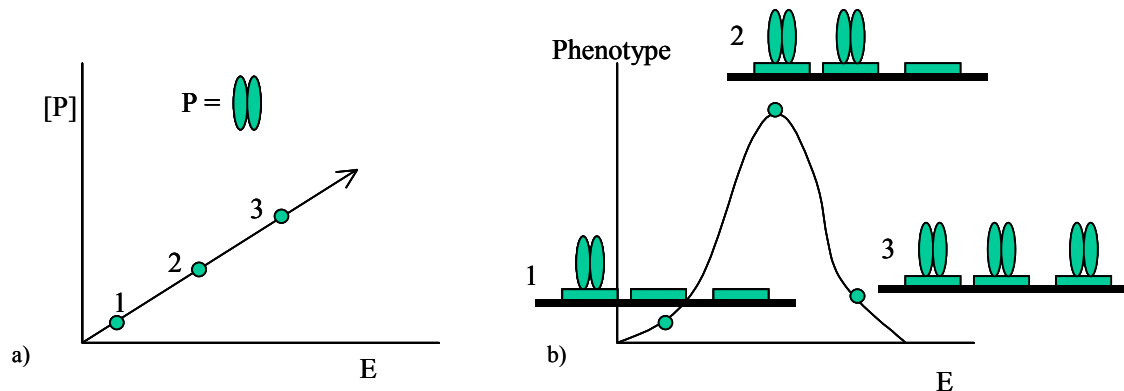
- Implemented by (1) differential H-NS repression of *fimB*, *fimE*, (2) competitive binding of FimB, FimE to switch, (3) FimE's strong ON-to-OFF bias
- Robust P_{on}^* vs. sensitive τ , decoupled control (*can control for changes in response time, detachment without changing %ON, attachment*)

Mechanism 2: A temperature tuning motif

Temp, medium \longrightarrow [Lrp],[leucine] \longrightarrow Lrp-A, 3 occupancy \longrightarrow max in piliation level at 37degC

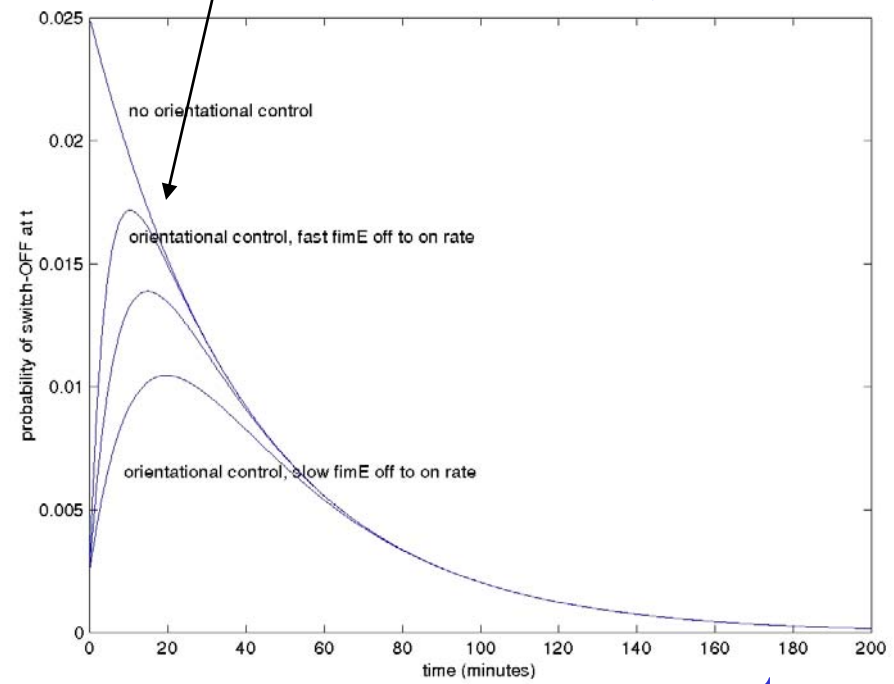
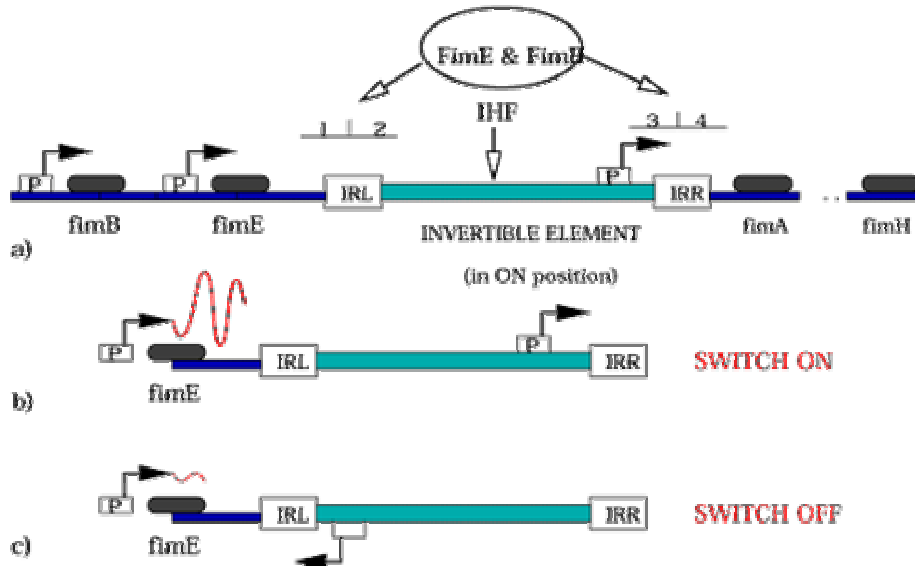


- *Local maximum in switch rate corresponds to local maximum in Lrp site-1,2 occupancy*
- *Common regulatory motif (e.g., OmpF, gltBDF,...)*

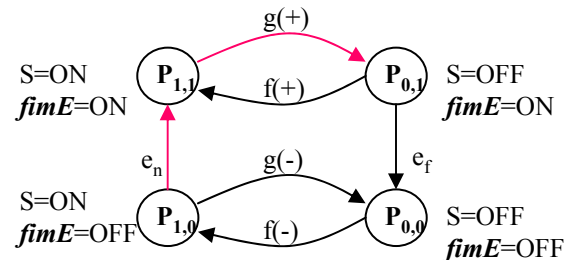


Mechanism 3: A time delay

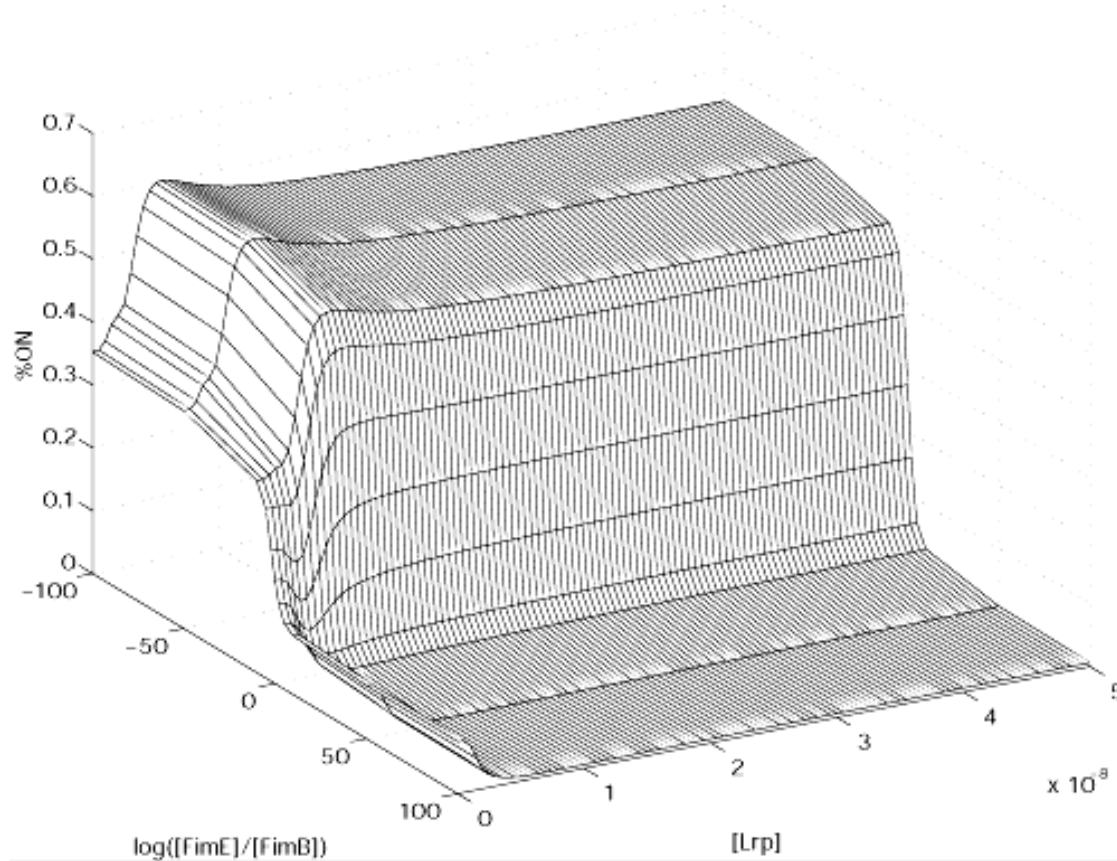
$p(S=ON \text{ at } t' / \text{OFF-to-ON switch at } t=0)$



- *fimE* orientational control acts as switch memory, delay (keeps switch on long enough to build pili), and prevents chatter.



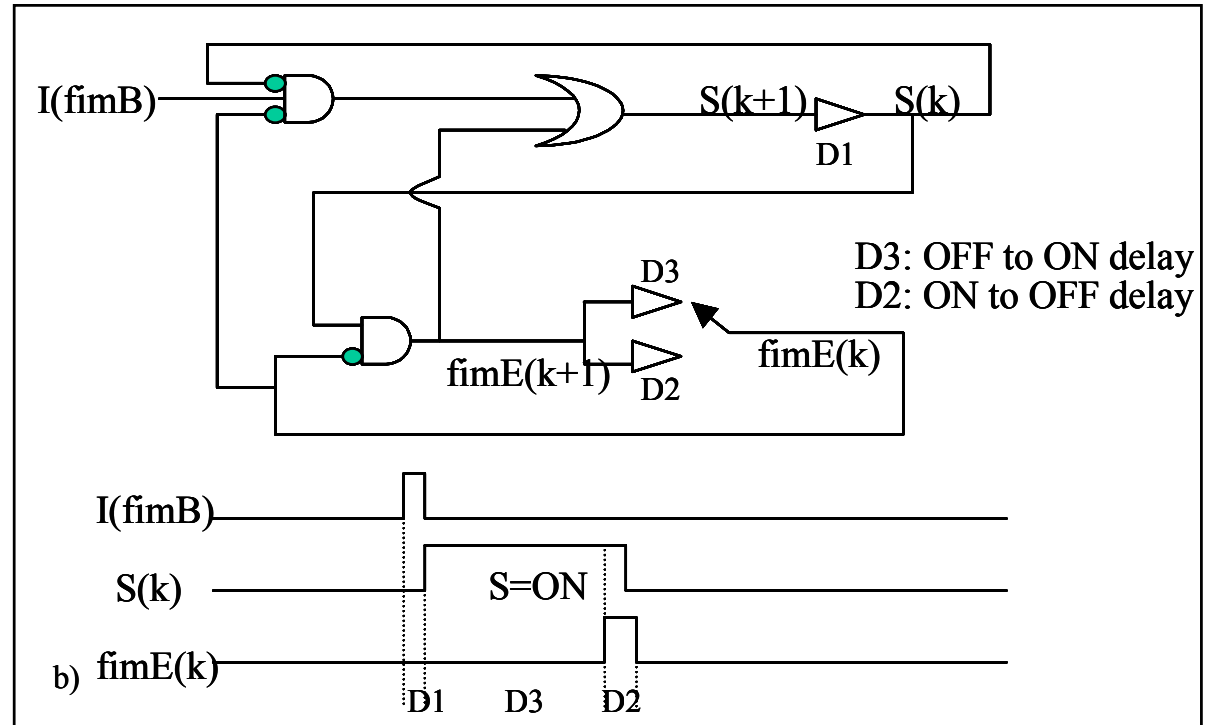
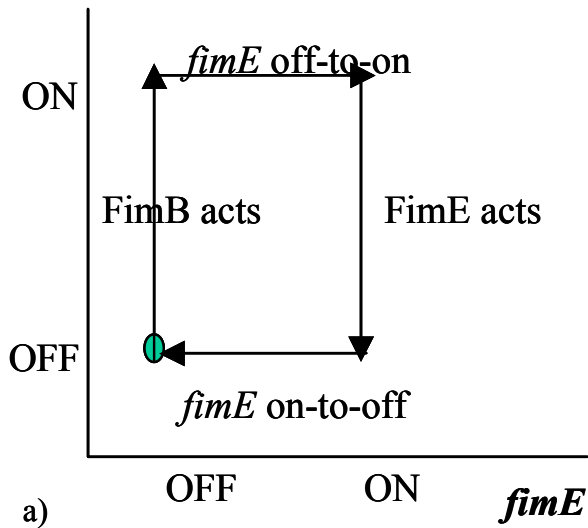
Synergy between mechanisms



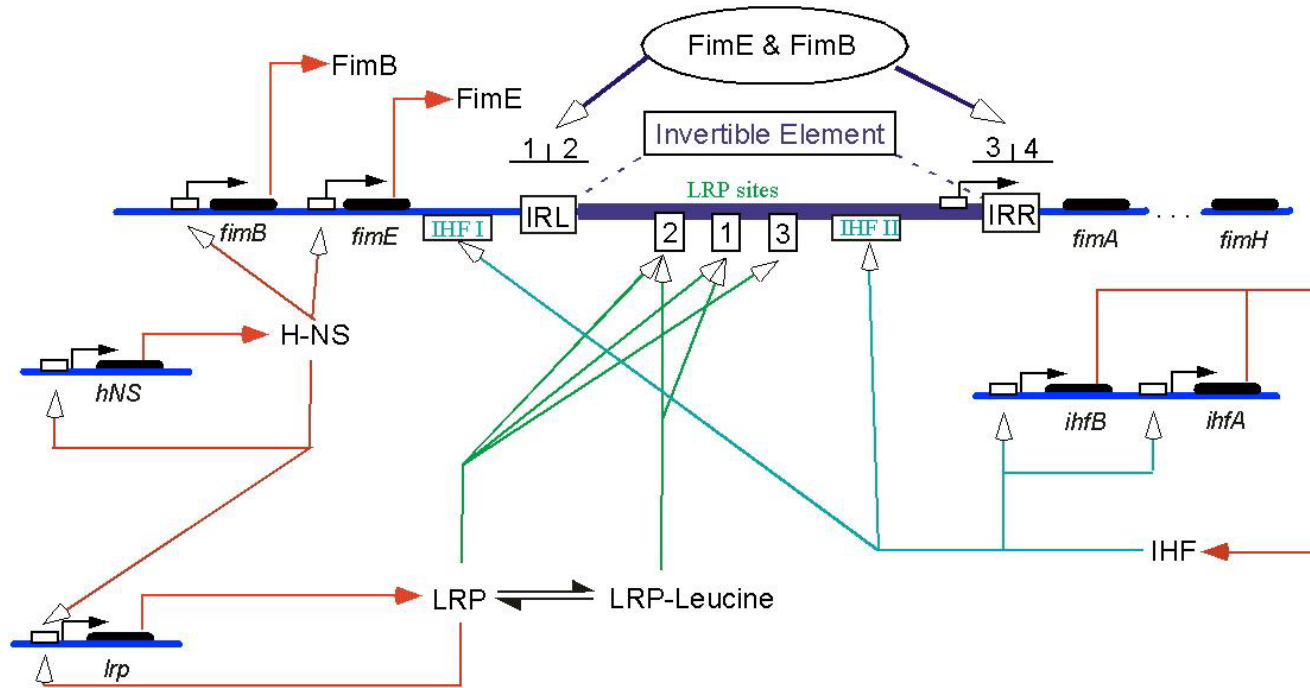
- Recombinase ratio based control and the phenotype tuning motif intersect through the *heights of the sigmoid asymptotes and slopes of transition regions*.
- Sigmoidal along $[FimE]/[FimB]$ axis, inverted parabolic along $[Lrp]$ axis .
- *fimE* orientational control increases sensitivity to environment, through $[FimB]$.

fim as digital circuit: a stochastic pulse generator

fim switch



Design questions from literature



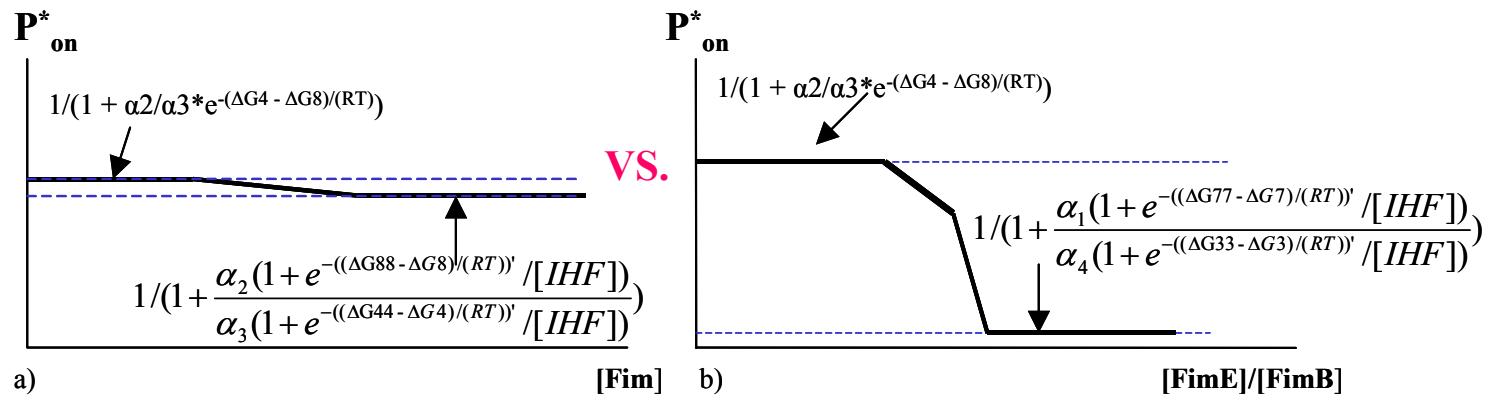
• Why *two* independent recombinases when one would suffice?

• Role of *orientational control* of *fimbE*?

• How is temperature control achieved? (*tuned to mammalian body temperature*)

Why Two Recombinases?

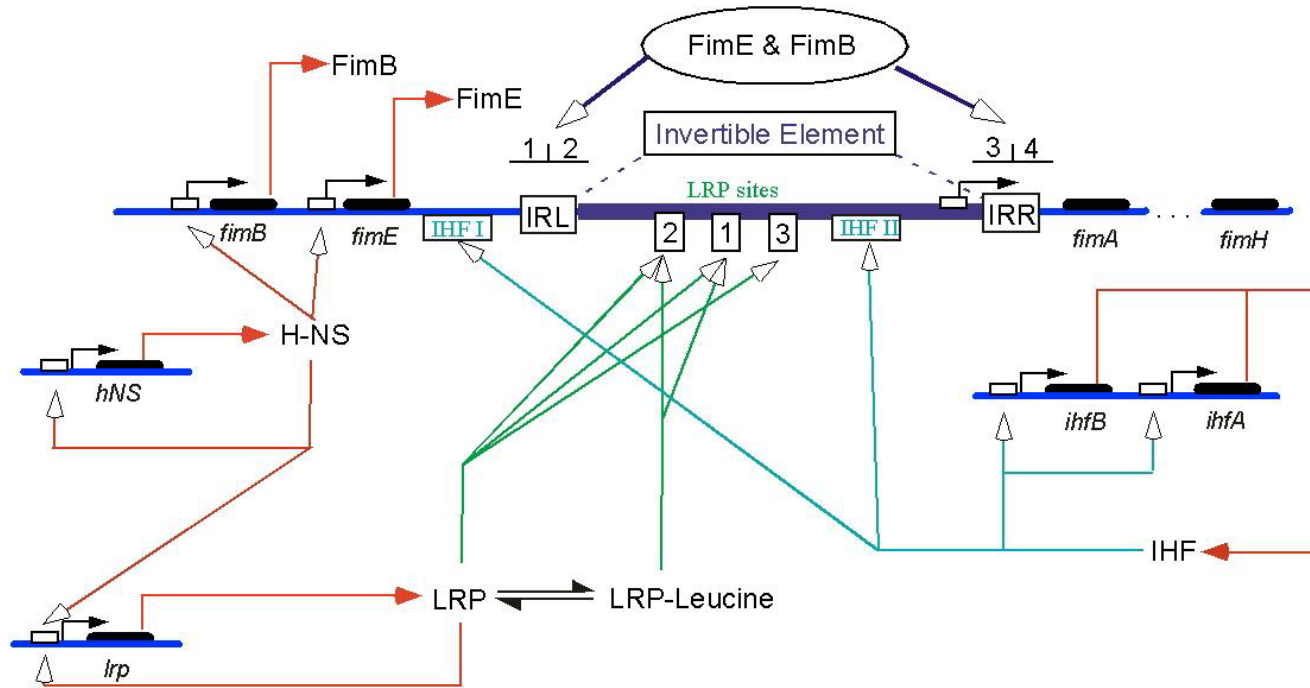
- One recombinase model



- Not sigmoidal -> *cannot act as small-signal switch*
- *Lost of environmental control*
- *Diminished, decoupling* of response speed and %ON

Evolutionary advantage to sensitive, **robust** control & **decoupling** of response speed and %ON control/robustness/parameter sensitivity?

Design questions from literature

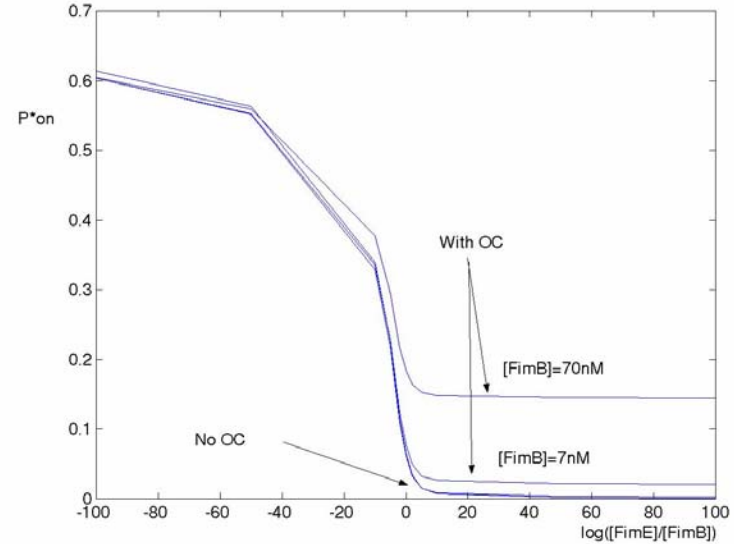
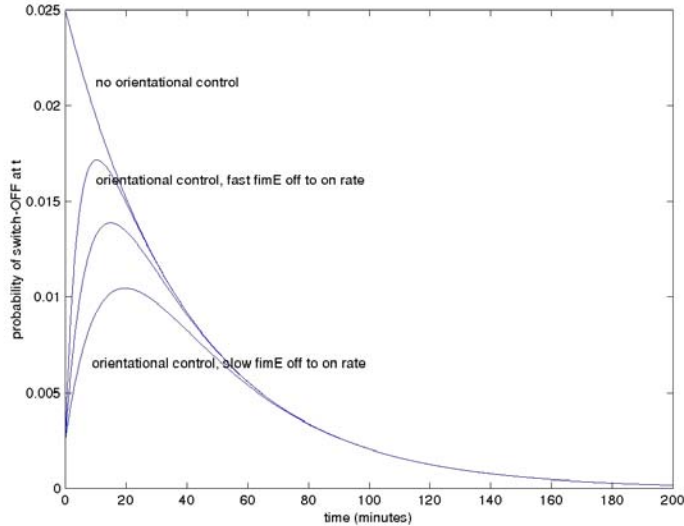


• Why *two* independent recombinases when one would suffice?

• Role of *orientational control* of *fimE*?

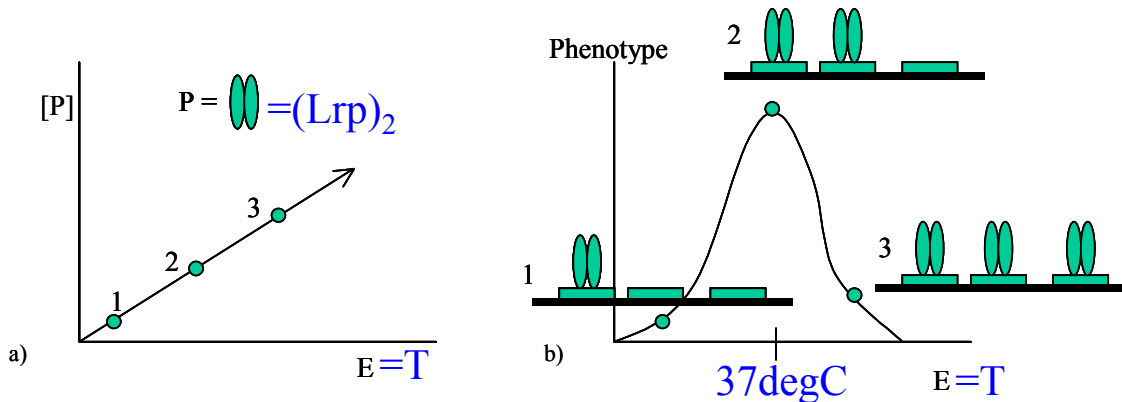
• How is temperature control achieved? (*tuned to mammalian body temperature*)

•Role of *orientational control of fimE?*

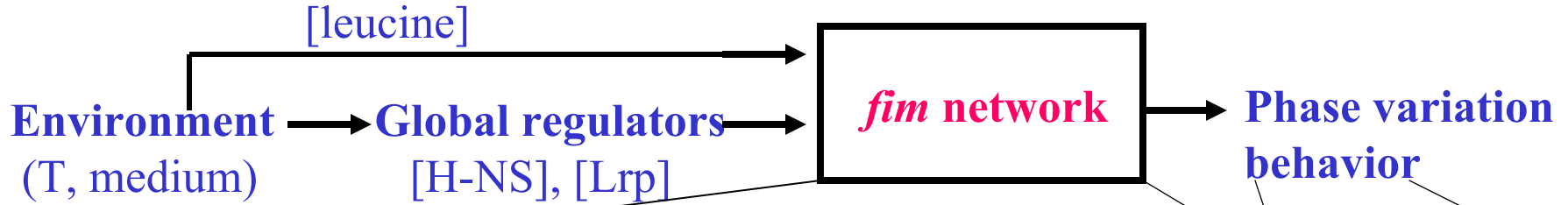


(1) Memory, (2) delay (keeps switch on long enough to build pili), (3) environmental sensitivity, (4) prevents chatter.

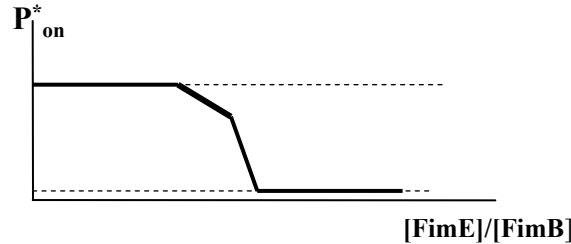
•How is temperature control achieved? (*tuned to mammalian host*)



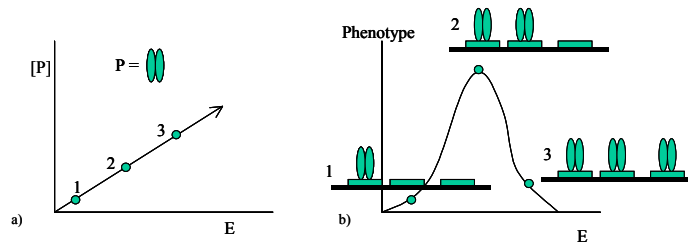
The *fim* network: an overview



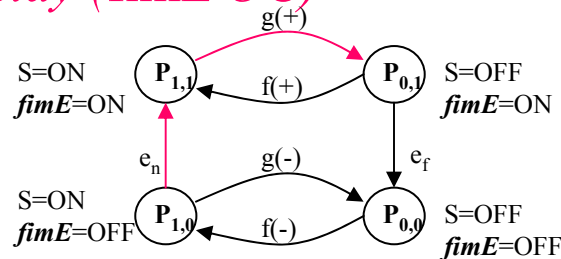
1. A recombinase ratio controlled switch



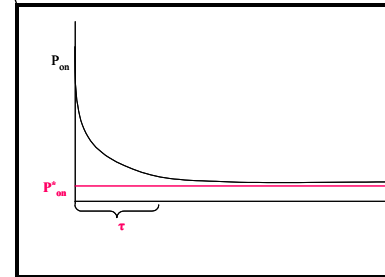
2. A temperature tuning motif



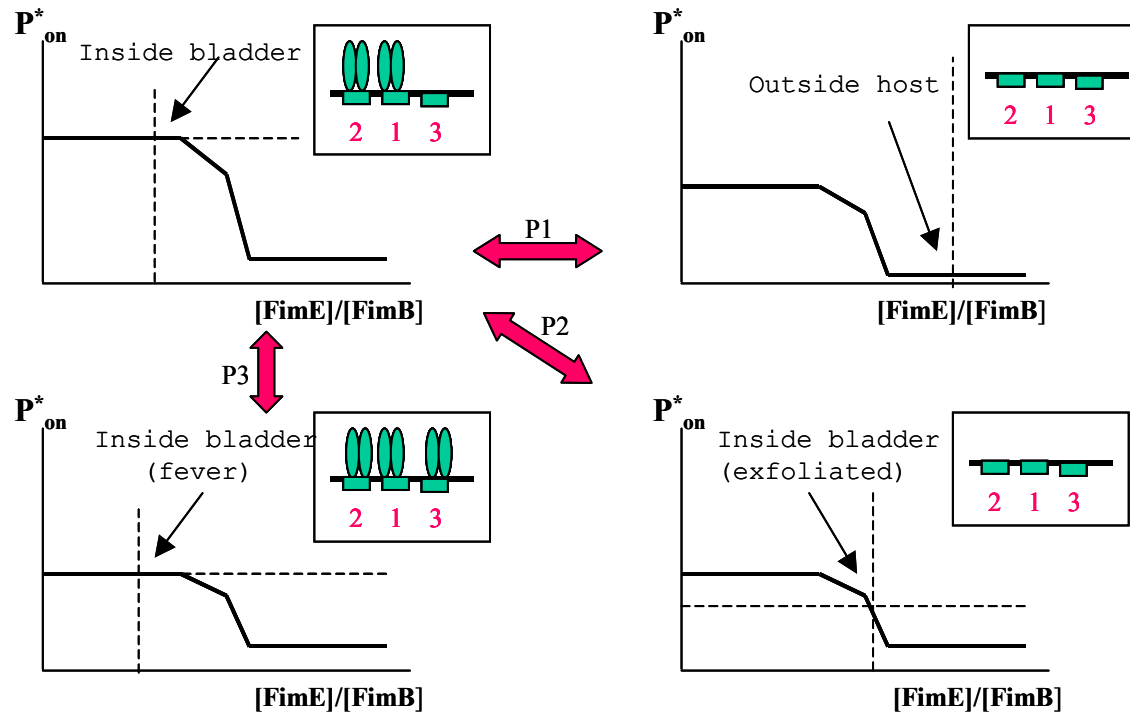
3. A time delay (*fimE* OC)



$$P_{on}^*, \tau, p(t')$$



Pathways to infection



- P1: Outside of host (unpilated) \Rightarrow inside host (pilated)
 $T \uparrow \Rightarrow$ H-NS derepression $\Rightarrow [FimE]/[FimB] \downarrow$, $[Lrp] \uparrow$, Lrp-A occupied
- P2: Exfoliation in host
 Medium richness $\uparrow \Rightarrow [FimE]/[FimB] \uparrow$, $[Lrp] \downarrow$
- P3: Fever in host
 $T > 37 \text{ degC} \Rightarrow [FimE]/[FimB] \downarrow$, $[Lrp] \uparrow$, Lrp-A, 3 occupied

Results Summary

- Robust $[FimE]/[FimB]$, $[Lrp]$ controlled switch:



- %ON* and response speed control **decoupled**

- *Two* vs. one recombinasesigmoid, decoupling, robustness

- ON-to-OFF *specificity of FimE* caused by switching rates, **not binding affinities**

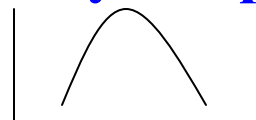
- *Orientalional control of fimE*

%ON(min), time ON greater, +redundant *fimE* spec.

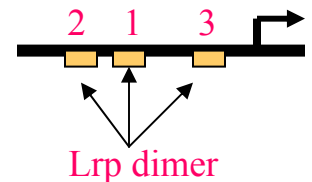
Memory, increased sensitivity to environment

- Temperature tuning to mammalian body temperature

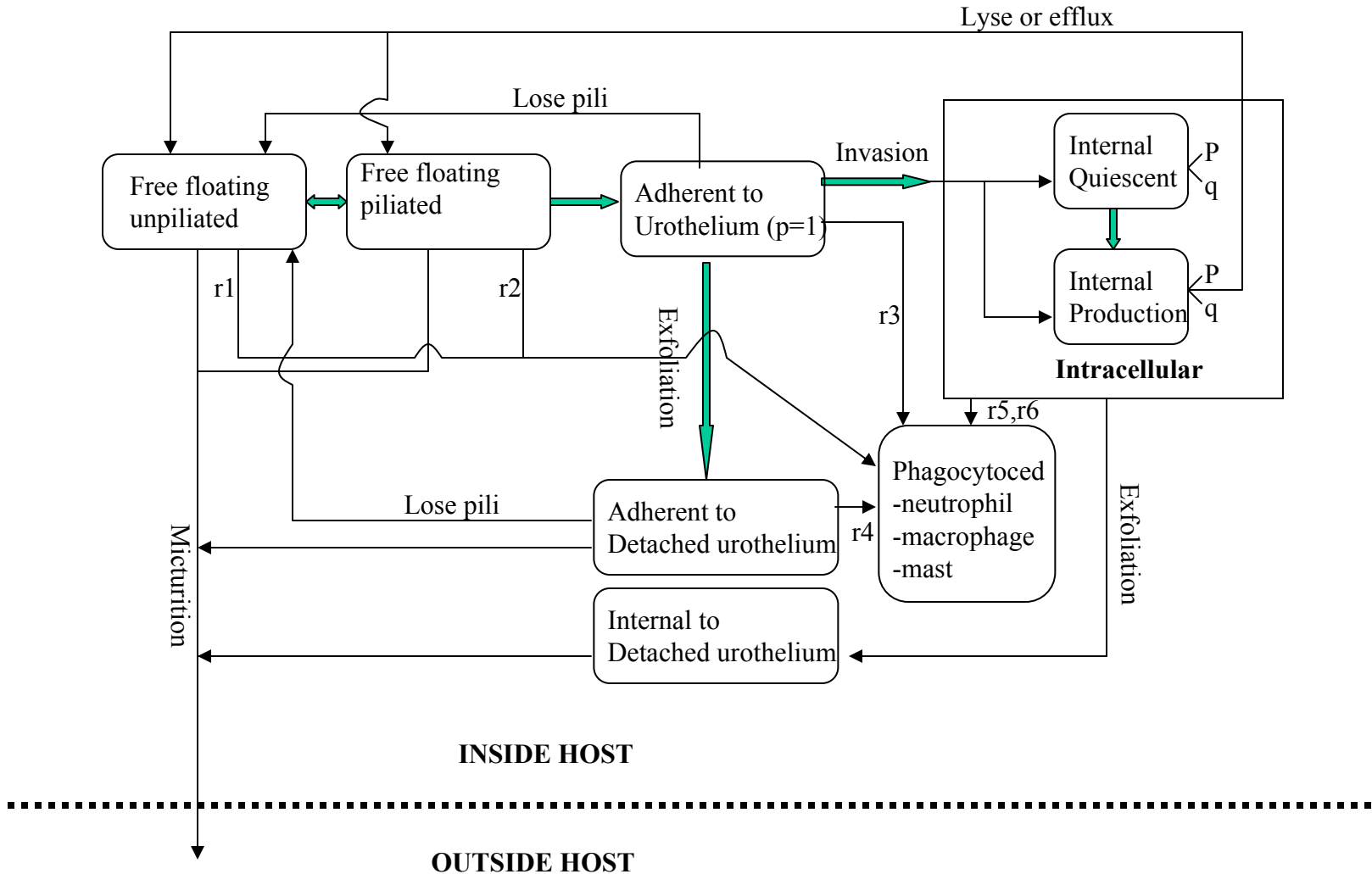
- Lrp site occupancy



- **General mechanism** for phenotype tuning to environment



Future work (?)

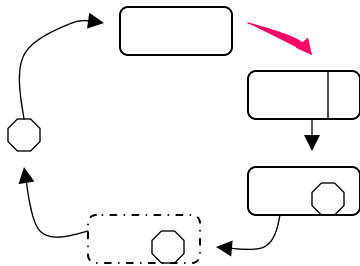


- What game are we playing?
- 3-D disease model.

Coming attractions

***B. subtilis* sporulation initiation**

- 48 molecular species
- Devices: two-component, phosphorelay, agonist/antagonist pair operons, import/export timing loops.
- >8 feedback loops, 2 (-), 6 (+)
- Signal integration, amplification, noise filtering?



Representations/analyses

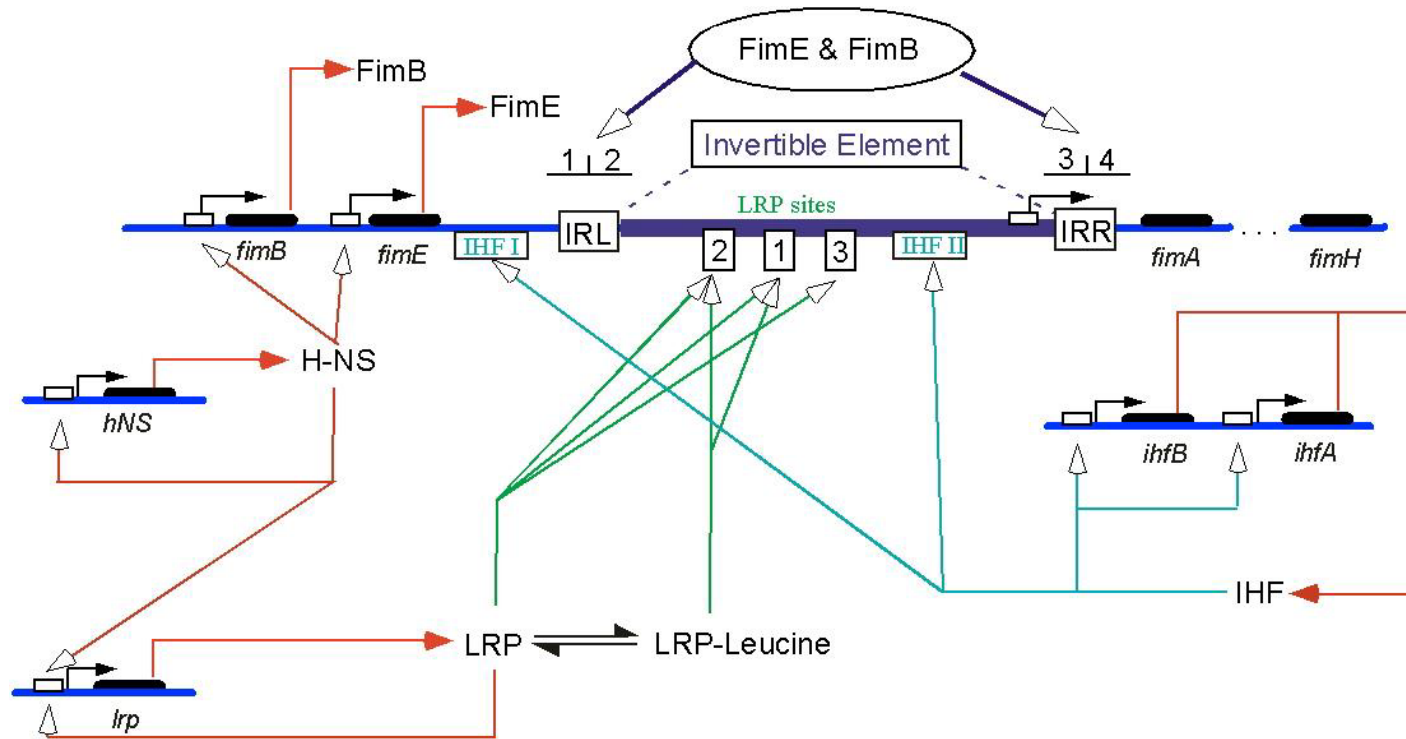
1. Connectivity (0,1)
2. Connectivity/Activity (0,1,-1,+/-1)
3. C/A/Inequality ($0, k_i, |k_n| < |k_{n-1}| < \dots < |k_1|$)
4. Piecewise linear
5. ...
6. Biophysical nonlinear

BioSPICE specs., algorithms

- Construct connectivity matrices
- Find optimal ordering for block diagonal, matrix pencil
- Identify and categorize destabilizing forces: catalytic elements, pairs, +/- feedback loops
- ...and so on...

The End

Question Addressed



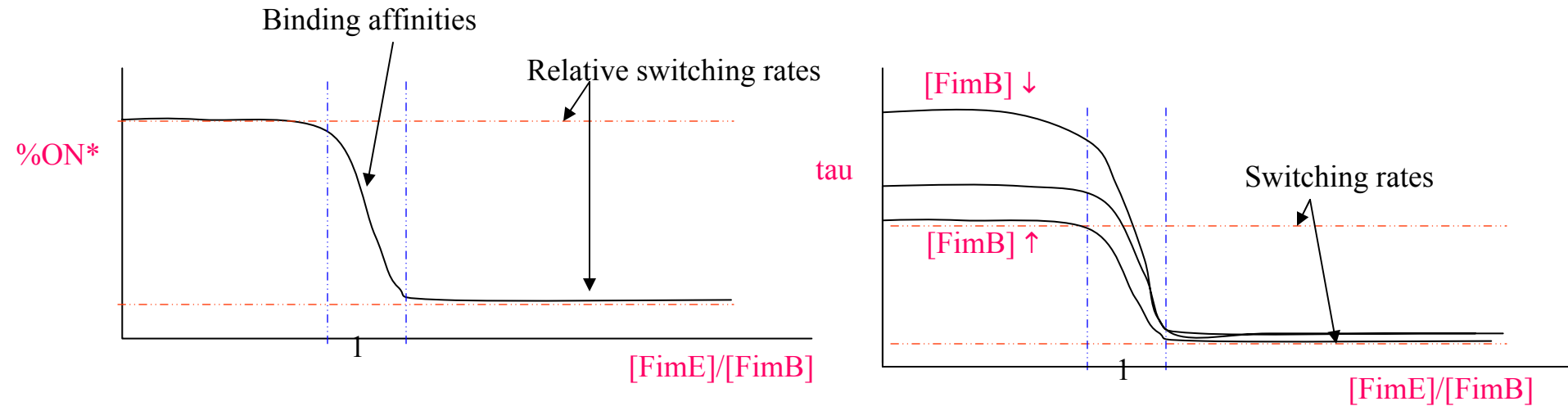
•Source of ON-to-OFF *specificity of FimE?* $.3/\text{cell/gen}$ vs $10^{-4}/\text{cell/gen}$

•Why *two* independent recombinases when one would suffice?

•Role of *orientational control* of *fimE*?

•How is temperature control achieved? (*tuned to mammalian body temperature*)

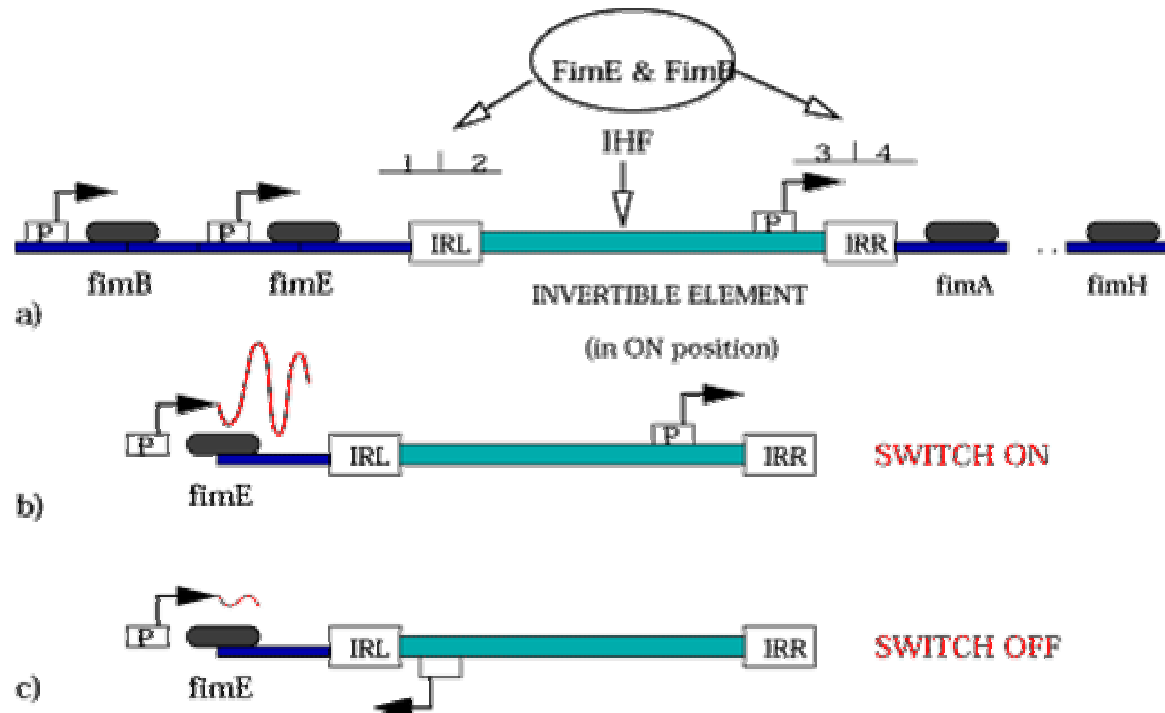
FimE ON-to-OFF specificity



Depends on operating points.

For most, *switching rates dominate, not binding affinities.*

System-level Questions



- Basic switch operation:

- Source of ON-to-OFF *specificity of FimE*?

- Why *two* independent recombinases when one would suffice?

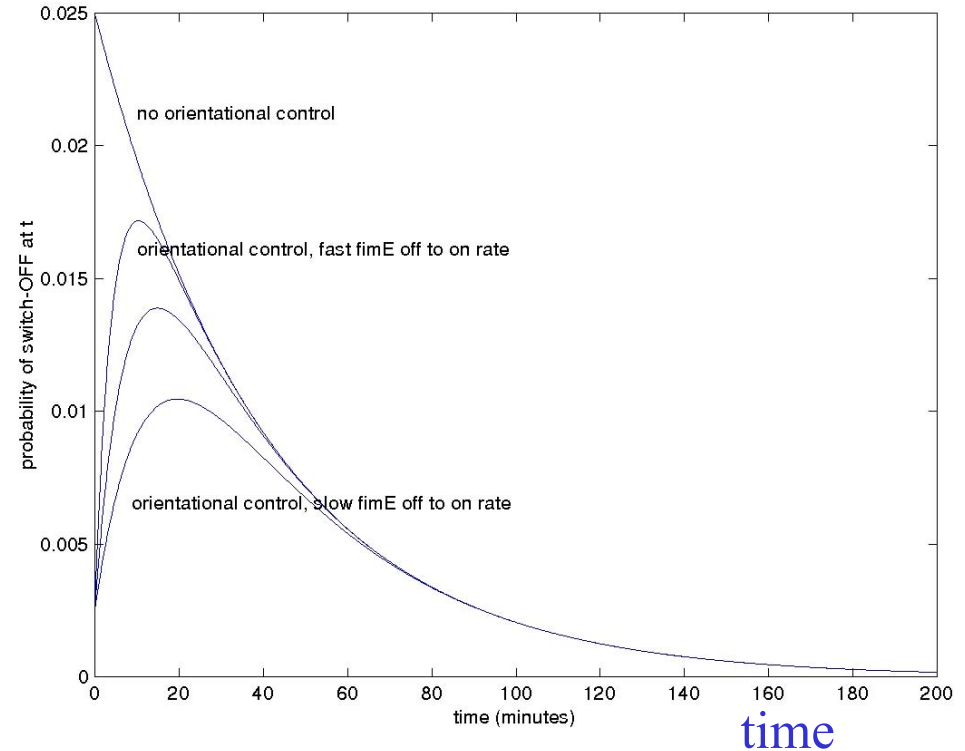
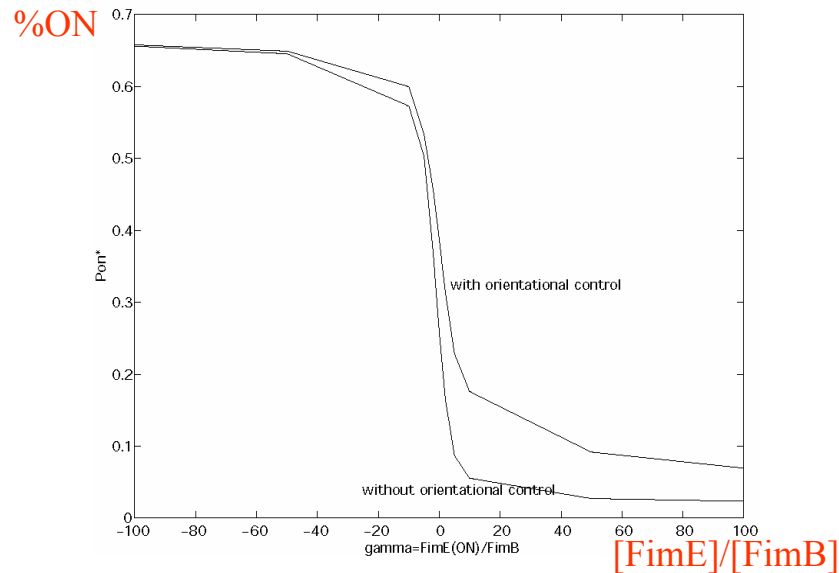
- Role of *orientational control* of *fimE*?

- How is temperature control achieved? (*tuned to mammalian body temperature*)

fimE Orientational Control (OC)

- Ensures switch **ON** long enough to build pili
- Increases **sensitivity** to growth medium, temp
- Adds **stochasticity** (increases turn OFF/detachment rate noise)

P(ON-to-OFF)



Q: Does *fimE* orientational control contribute to FimE specificity?

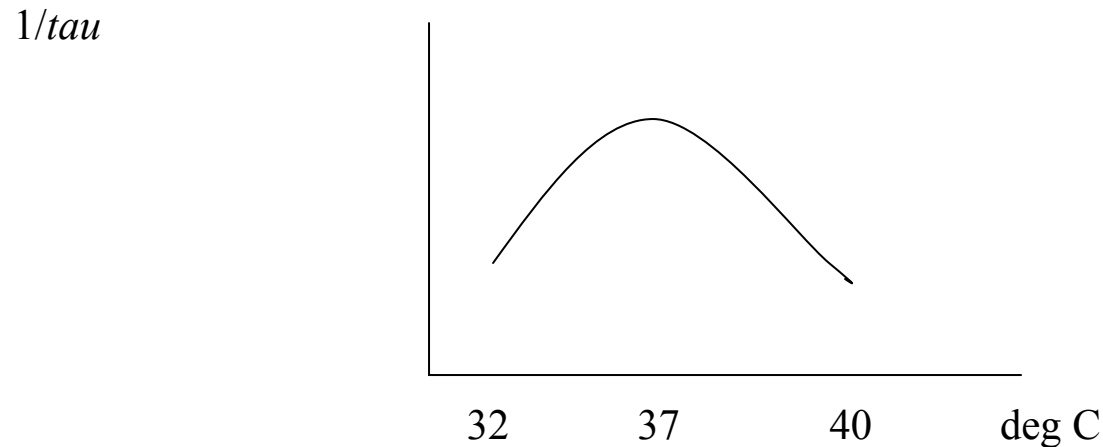
A: Yes and no. No, in that ..

*** (Time ON and minimum %ON greater than it would be without orientational control)**

*** Yes, in that IF FimE unstable, OC maintains specificity even if high OFF-to-ON rate (acts as redundant mechanism)**

System-level Questions

- Basic switch operation:
- Source of ON-to-OFF *specificity of FimE*?
- Why *two* independent recombinases when one would suffice?
- Role of *orientational control* of *fimE*?
- How is temperature control achieved? (*tuned to mammalian body temperature*)



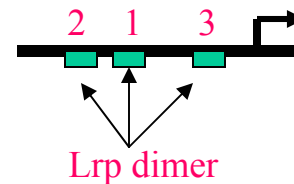
Local maximum in switching rate in *fimE*- mutant at 37 deg C

Hypothesis Development

- FimE out of picture... forget $\alpha = [\text{FimE}]/[\text{FimB}]$
- know switching rate monotonic in $[\text{FimB}]$
- Simplest answer: $[\text{FimB}]$ has local max w/Temp....no, not the way H-NS works.

•Lrp?

- H-NS represses *lrp*, H-NS controlled by T, so $T \uparrow$ should imply $Lrp \uparrow$

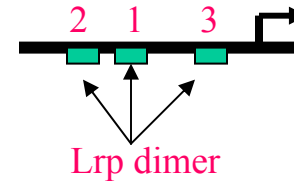
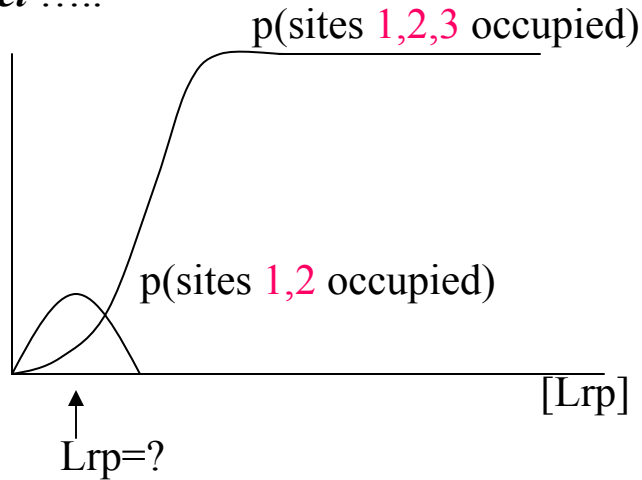


- How does Lrp bind to switch?
 - Three sites. Either (1), (2) bound with Lrp, or (1),(2),(3) bound with Lrp
 - If site (3) mutated out, **switching rate** \uparrow (*leucine experiments*)

Hypothesis: *local maximum in switch rate corresponds to local maximum in Lrp site-1,2 occupancy*

Hypothesis tested, confirmed, generalized

Model



Data \Rightarrow binding affinities \Rightarrow max occurs at physiologic [Lrp], T=37

General mechanism? Evolutionarily plausible for phenotype 'tuning'
(e.g. b-galactosidase operon, osmoregulatory porin regulation)

Maximum # extrema = (# energetically separated binding site clusters) - 1

Future Work Plans

Study virulence

- E. coli cell/population model + tissue model \implies *disease analysis*

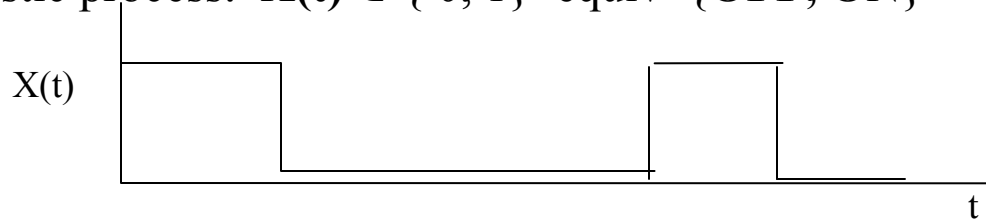
Genetic engineering

- Control motif library \implies genetic circuit CAD

design and build multi-dimensional gene expression/repression systems

Model invertible element

Stochastic process: $X(t) \in \{0, 1\}$ equiv $\{\text{OFF}, \text{ON}\}$



Associated with *probability distribution* $P(t)$

P_{on} = Probability switch is in ON position

ASSUME: Markov process \rightarrow **Master Equation** formulation

- $$P_{\text{on}}(t) = W_{\text{off-to-on}} (1 - P_{\text{on}}(t)) - W_{\text{on-to-off}} P_{\text{on}}(t)$$

Mathematical expressions of behavioral descriptors P_{on}^* , $P(t')$, τ

- Without *finE* orientational control

$$P_{on}^* = f/(f+g) \text{ and time constant } \tau = 1/(f+g)$$

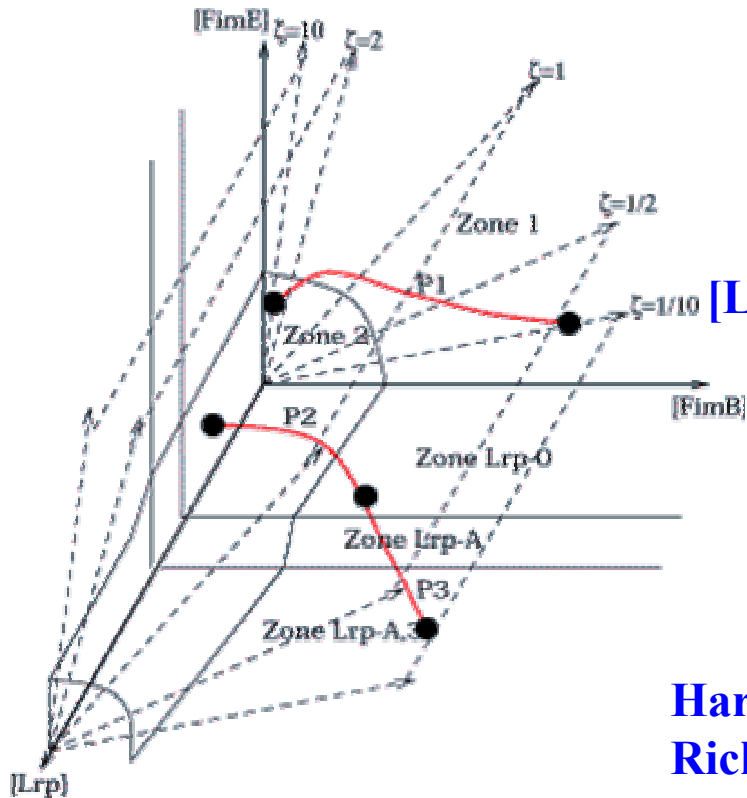
$$P(t')_{on \rightarrow off} = g \times e^{-gt'}$$

- With *finE* orientational control

$$P_{on}^* = \frac{\frac{g(+)}{e_n} + \frac{f(+)}{e_f}}{\frac{g(+)}{e_n} + \frac{f(+)}{e_f} + \frac{g(+)}{e_f} + \frac{g(+)}{e_n} + f(-) + g(+)}$$

$$P(t')_{on \rightarrow off} = g(-)e^{-(g(-)+e_n)t'} + g(+)e^{-g(+)t'} \left(1 - e^{-e_n t'} \right)$$

Environmental control



$[FimE]/[FimB]$: \downarrow TEMP, \uparrow nutrition (H-NS)

$[Lrp]$: \downarrow NUTRITION, \uparrow temp (growth rate, H-NS)

FimE,B: Zone 1- high T, poor nutrition

Zone 2- lower T, rich nutrition

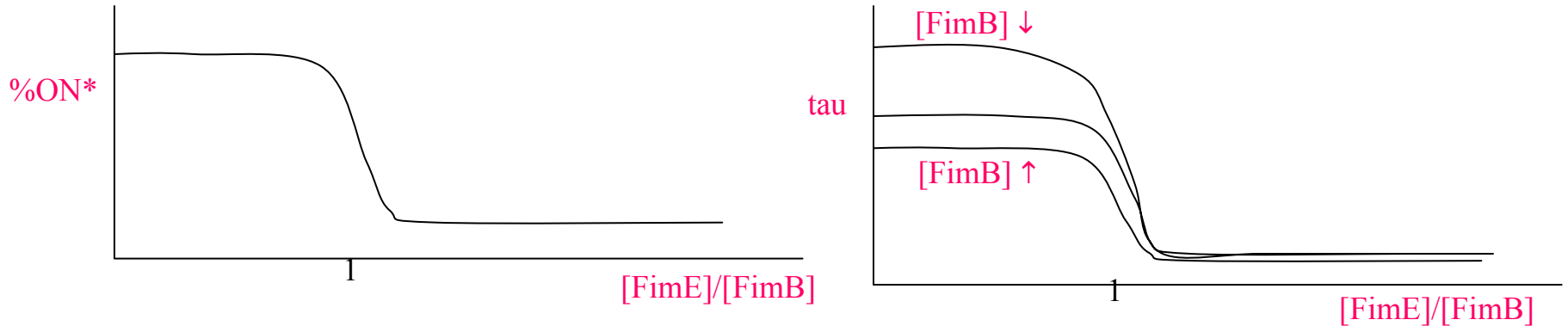
SURVIVAL:

Harsh - more pili, slower turn-OFF

Rich - fewer pili, fast turn-OFF

THE BODY: interplay of both, temperature tuned

Decoupling of Equilibrium %ON, Response Speed



- Both **sigmoids** - sensitive, insensitive regions w/ respect to $[FimE]/[FimB]$
- Sigmoid **Max/Min asymptotes**
 - same parameters
 - different - **Pon*** controlled by **relative** differences, **tau** controlled by **absolute** values
- **Coupled** by $alpha = [FimE]/[FimB]$
- **Decoupled** by $[FimE]$, $[FimB]$, switching rates, binding affs

Consequence: *can control for changes in response time, detachment without changing equilibrium %ON, attachment*