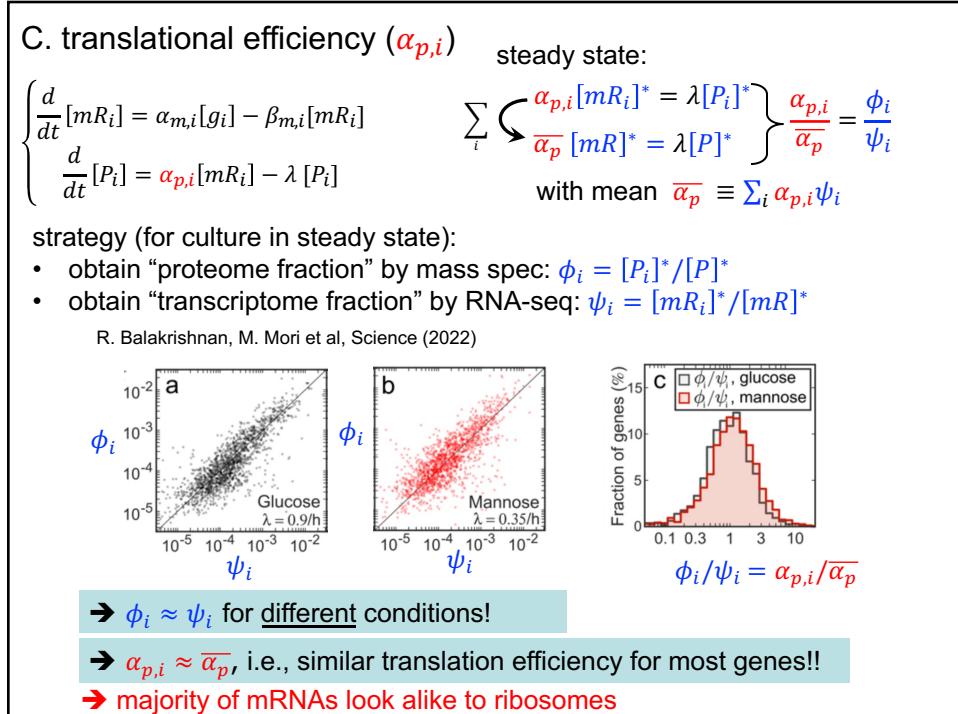


26



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C. translational efficiency ($\alpha_{p,i}$)

$$\begin{cases} \frac{d}{dt}[mR_i] = \alpha_{m,i}[g_i] - \beta_{m,i}[mR_i] \\ \frac{d}{dt}[P_i] = \color{red}\alpha_{p,i}[mR_i] - \lambda[P_i] \end{cases}$$

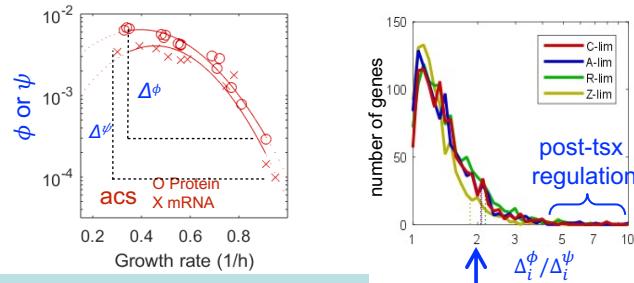
steady state:

$$\sum_i \left\{ \frac{\alpha_{p,i} [mR_i]^* = \lambda [P_i]^*}{\bar{\alpha}_p [mR]^* = \lambda [P]^*} \right\} \frac{\alpha_{p,i}}{\bar{\alpha}_p} = \frac{\phi_i}{\psi_i}$$

with mean $\bar{\alpha}_p \equiv \sum_i \alpha_{p,i} \psi_i$

strategy (for culture in steady state):

- obtain “proteome fraction” by mass spec: $\phi_i = [P_i]^* / [P]^*$
 - obtain “transcriptome fraction” by RNA-seq: $\psi_i = [m_{R_i}]^* / [mR]^*$



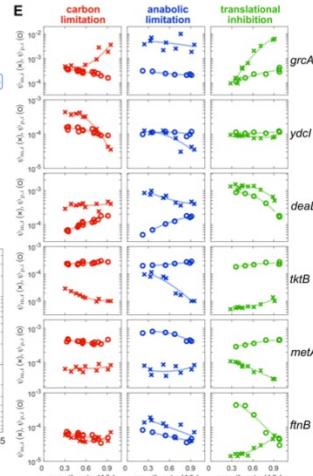
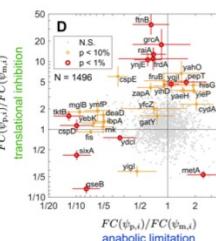
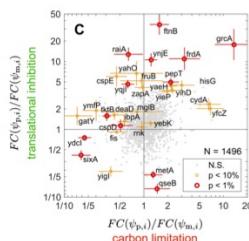
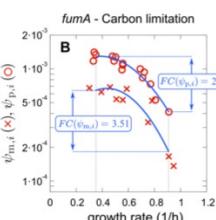
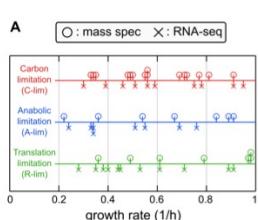
→ $\phi_i \approx \psi_i$ for different conditions!

→ $\alpha_{p,i} \approx \overline{\alpha_p}$, i.e., similar translation efficiency for most genes!!

→ majority of mRNAs look alike to ribosomes

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genes showing differential regulation of mRNA and proteins



→ $\phi_i \approx \psi_i$ for different conditions!

→ $\alpha_{n,i} \approx \overline{\alpha_n}$, i.e., similar translation efficiency for most genes!!

→ majority of mRNAs look alike to ribosomes

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Topic 5: Global effects of gene expression

Description of individual genes:

$$\begin{cases} \frac{d}{dt}[mR_i] = \alpha_{m,i}[g_i] - \beta_{m,i}[mR_i] \\ \frac{d}{dt}[P_i] = \alpha_{p,i}[mR_i] - \lambda[P_i] \end{cases}$$

$\alpha_{m,i}$ = mRNA synthesis rate/promoter

$\beta_{m,i}$ = mRNA degradation rate

$\alpha_{p,i}$ = protein synthesis rate/mRNA

λ = cell growth rate (proteins stable)

transcriptional regulation

$$\alpha_{m,i} = \alpha_{m,0} \cdot \mathcal{P}_i(\dots) = \alpha_{m,0} \frac{[RNAP]_{av}}{K_{P,i}} \cdot \mathcal{R}_i(\dots)$$

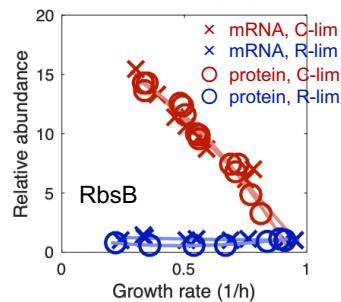
$$\frac{d}{dt}[mR_i] = 0 \Rightarrow [mR_i]^* = \frac{\alpha_{m,i}}{\beta_{m,i}}[g_i]$$

$$\frac{d}{dt}[P_i] = \underbrace{\alpha_{p,i} \cdot [mR_i]^*}_{\alpha_i \text{ protein synth. flux}} - \lambda \cdot [P_i]$$

(aka "promoter activity")

Puzzles:

- mRNA level is thought to reflect "promoter activity"; why not??
- where did the dilution effect go?
- much simpler job for gene regulation if true
- how does E. coli do it?



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C. translational efficiency ($\alpha_{p,i}$)

$$\begin{cases} \frac{d}{dt}[mR_i] = \alpha_{m,i}[g_i] - \beta_{m,i}[mR_i] \\ \frac{d}{dt}[P_i] = \alpha_{p,i}[mR_i] - \lambda[P_i] \end{cases}$$

steady state:

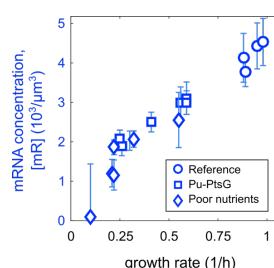
$$\sum_i \frac{\alpha_{p,i}[mR_i]^*}{\alpha_p[mR]^*} = \frac{\lambda[P_i]^*}{\lambda[P]^*} \quad \frac{\alpha_{p,i}}{\alpha_p} = \frac{\phi_i}{\psi_i}$$

with mean $\overline{\alpha_p} \equiv \sum_i \alpha_{p,i} \psi_i$

Q: source of constraint on the total flux of protein synthesis $\overline{\alpha_p} [mR]^*$?

→ mRNA abundance nearly matched to the growth rate

→ translational initiation rate $\overline{\alpha_p}$ nearly growth independent



$$\rightarrow [mR]^* \sim \lambda \quad \overline{\alpha_p} \sim [P]^* \approx \text{const}$$

reexamine protein synth flux ('promoter activity')

$$\lambda[P_i]^* = \alpha_{p,i}[mR_i]^* \approx \overline{\alpha_p} \cdot \psi_i \cdot [mR]^*$$

since $\alpha_{p,i} \approx \overline{\alpha_p}$ for typical genes

→ protein synth flux does not give promoter activity
(dominated by GR itself)

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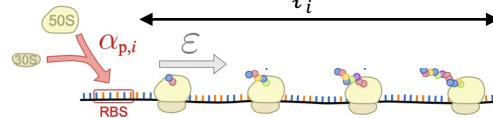
C. translational efficiency ($\alpha_{p,i}$)

$$\begin{cases} \frac{d}{dt}[mR_i] = \alpha_{m,i}[g_i] - \beta_{m,i}[mR_i] \\ \frac{d}{dt}[P_i] = \alpha_{p,i}[mR_i] - \lambda [P_i] \end{cases}$$

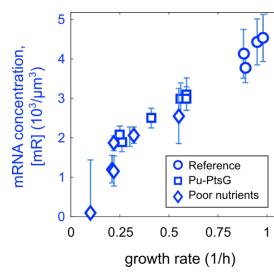
steady state:

$$\sum_i \left\{ \begin{array}{l} \alpha_{p,i}[mR_i]^* = \lambda[P_i]^* \\ \alpha_p[mR]^* = \lambda[P]^* \end{array} \right\} \frac{\alpha_{p,i}}{\alpha_p} = \frac{\phi_i}{\psi_i}$$

with mean $\bar{\alpha}_p \equiv \sum_i \alpha_{p,i} \psi_i$



protein synthesis flux:
 $\lambda[P_i]^* \cdot \ell_i = \varepsilon \cdot [Rb]_{act}^*$



total flux of protein synthesis: [avg protein length: $\ell \equiv \sum_i \ell_i \phi_i$]
 $\lambda[P]^* \cdot \bar{\ell} = \varepsilon \cdot [Rb]_{act}^* \Rightarrow \bar{\alpha}_p [mR]^* \cdot \bar{\ell} = \varepsilon [Rb]_{act}^* \Rightarrow \frac{\bar{\alpha}_p \cdot \bar{\ell}}{\varepsilon} = \frac{[Rb]_{act}^*}{[mR]^*}$

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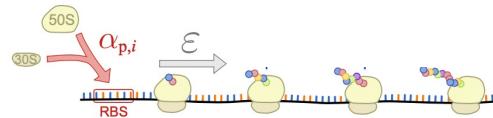
C. translational efficiency ($\alpha_{p,i}$)

$$\begin{cases} \frac{d}{dt}[mR_i] = \alpha_{m,i}[g_i] - \beta_{m,i}[mR_i] \\ \frac{d}{dt}[P_i] = \alpha_{p,i}[mR_i] - \lambda [P_i] \end{cases}$$

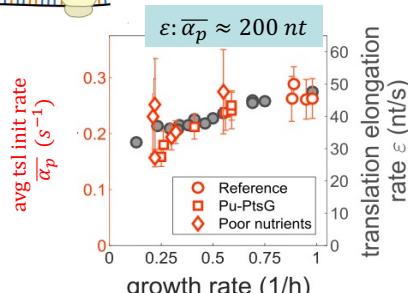
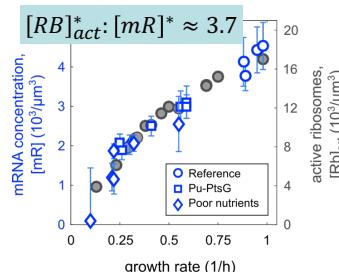
steady state:

$$\sum_i \left\{ \begin{array}{l} \alpha_{p,i}[mR_i]^* = \lambda[P_i]^* \\ \alpha_p[mR]^* = \lambda[P]^* \end{array} \right\} \frac{\alpha_{p,i}}{\alpha_p} = \frac{\phi_i}{\psi_i}$$

with mean $\bar{\alpha}_p \equiv \sum_i \alpha_{p,i} \psi_i$



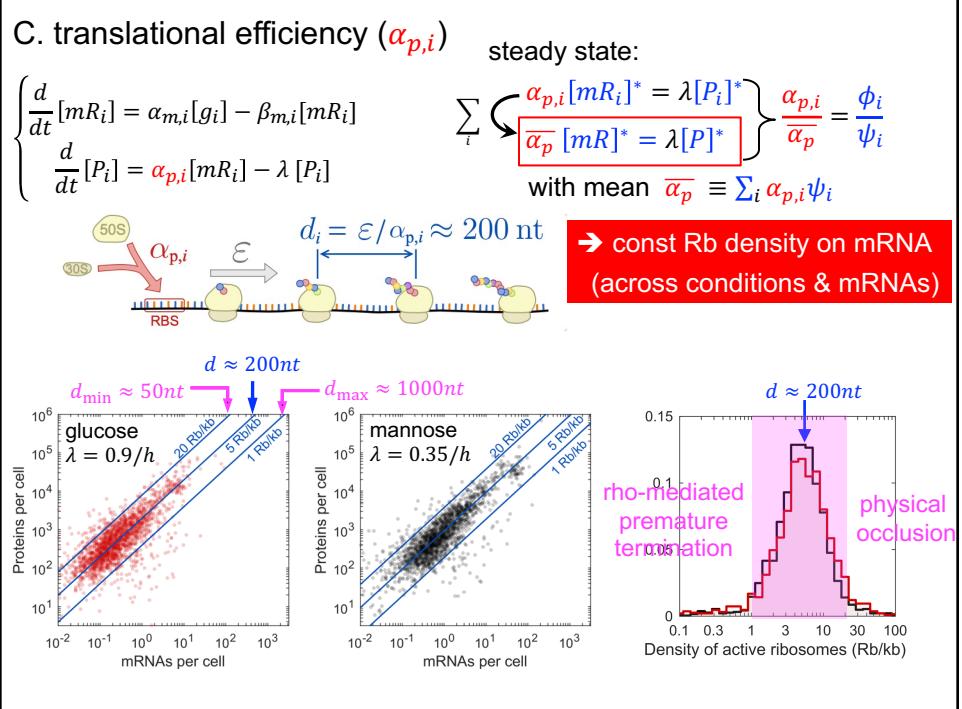
→ const Rb density on mRNA
 (across conditions & mRNAs)



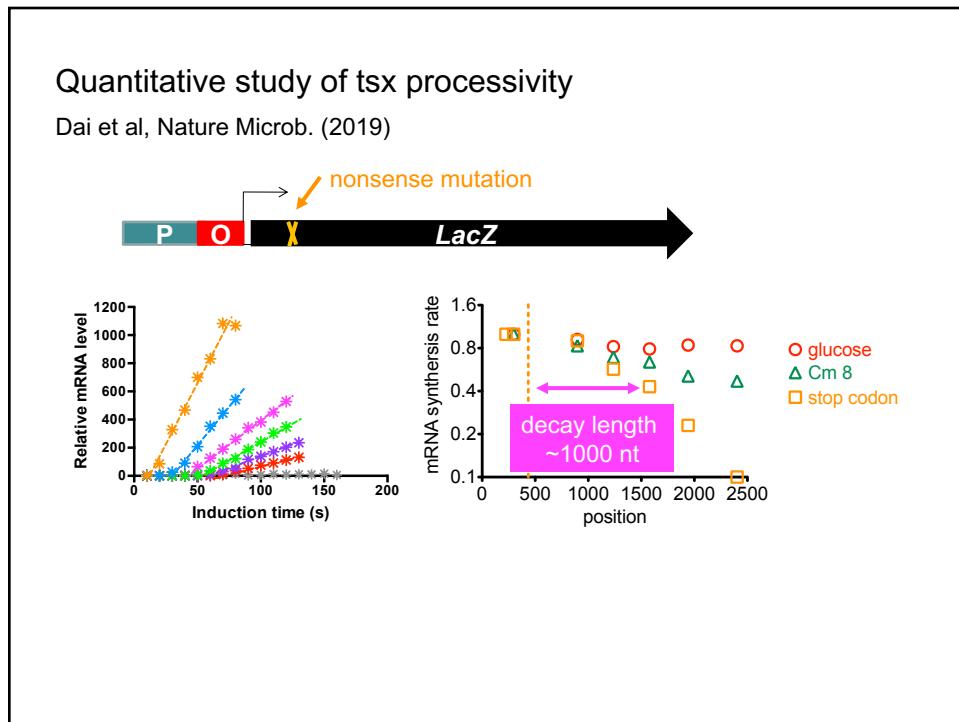
total flux of protein synthesis:

$$\lambda[P]^* \cdot \bar{\ell} = \varepsilon \cdot [Rb]_{act}^* \Rightarrow \bar{\alpha}_p [mR]^* \cdot \bar{\ell} = \varepsilon [Rb]_{act}^* \Rightarrow \frac{\bar{\alpha}_p \cdot \bar{\ell}}{\varepsilon} = \frac{[Rb]_{act}^*}{[mR]^*}$$

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C. translational efficiency ($\alpha_{p,i}$)

$$\begin{cases} \frac{d}{dt}[mR_i] = \alpha_{m,i}[g_i] - \beta_{m,i}[mR_i] \\ \frac{d}{dt}[P_i] = \alpha_{p,i}[mR_i] - \lambda [P_i] \end{cases}$$

steady state:

$$\sum_i \left\{ \begin{array}{l} \alpha_{p,i}[mR_i]^* = \lambda[P_i]^* \\ \alpha_p[mR]^* = \lambda[P]^* \end{array} \right\} \frac{\alpha_{p,i}}{\alpha_p} = \frac{\phi_i}{\psi_i}$$

with mean $\bar{\alpha}_p \equiv \sum_i \alpha_{p,i} \psi_i$

Q: source of constraint on the total flux of protein synthesis $\bar{\alpha}_p [mR]^*$?

→ mRNA abundance nearly matched to the growth rate

→ translational initiation rate $\bar{\alpha}_p$ nearly growth independent

Next: how is mRNA abundance set?

$$[mR_i]^* = \alpha_{m,i}[g_i]/\beta_{m,i} \quad (\text{via synthesis or turnover?})$$

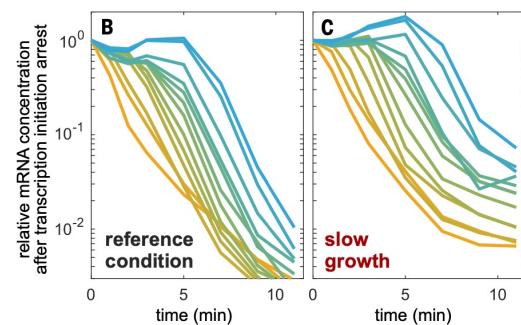
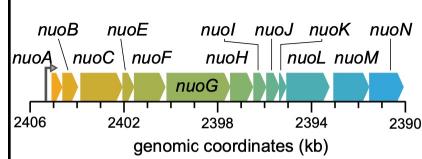
36

mRNA turnover ($\beta_{m,i}$)

$$\begin{cases} \frac{d}{dt}[mR_i] = \alpha_{m,i}[g_i] - \beta_{m,i}[mR_i] \\ \frac{d}{dt}[P_i] = \alpha_{p,i}[mR_i] - \lambda [P_i] \end{cases}$$

- stop initiation of transcription at 't = 0' (rifampicin)
- measure mRNA abundance for $t > 0$ (RNA-seq)
- fit to delayed exponential decay (only relative abundance required):

$$[mR_i](t) = [mR_i](0) \cdot e^{-\beta_{m,i}(t-t_{0,i})}$$



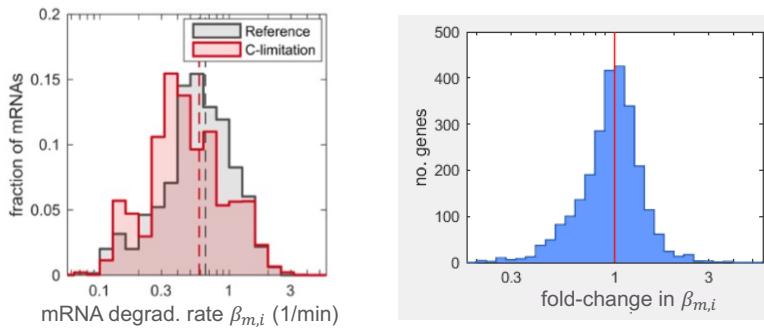
37

mRNA turnover ($\beta_{m,i}$) weakly dependent on gene and condition

$$\begin{cases} \frac{d}{dt}[mR_i] = \alpha_{m,i}[g_i] - \beta_{m,i}[mR_i] \\ \frac{d}{dt}[P_i] = \alpha_{p,i}[mR_i] - \lambda[P_i] \end{cases} \rightarrow \beta_{m,i} \approx \bar{\beta}_{m,i} \equiv \sum_i \beta_{m,i} \psi_i \approx 0.5/\text{min}$$

- stop initiation of transcription at ' $t = 0$ ' (rifampicin)
- measure mRNA abundance for $t > 0$ (RNA-seq)
- fit to delayed exponential decay (only relative abundance required):

$$[mR_i](t) = [mR_i](0) \cdot e^{-\beta_{m,i}(t-t_0)}$$



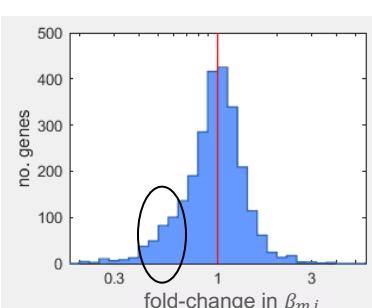
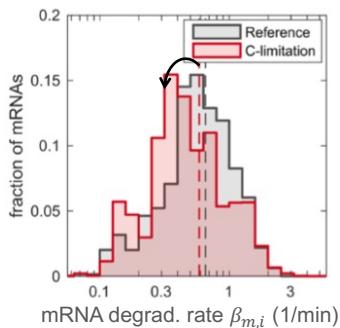
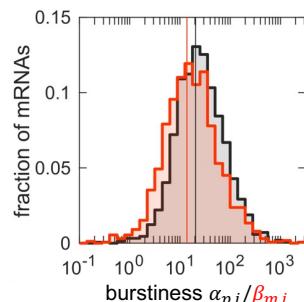
38

mRNA turnover ($\beta_{m,i}$)

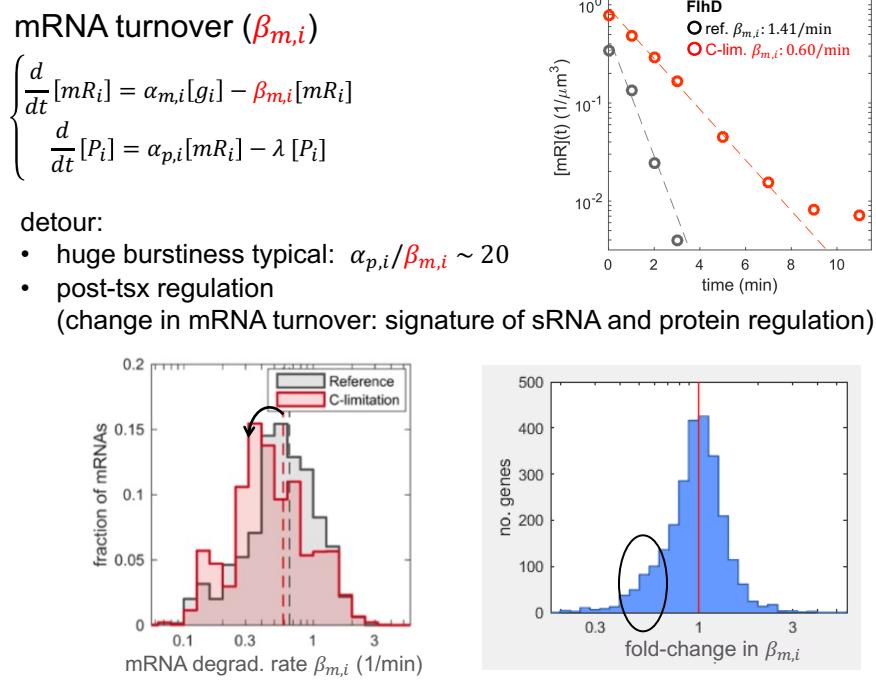
$$\begin{cases} \frac{d}{dt}[mR_i] = \alpha_{m,i}[g_i] - \beta_{m,i}[mR_i] \\ \frac{d}{dt}[P_i] = \alpha_{p,i}[mR_i] - \lambda[P_i] \end{cases}$$

detour:

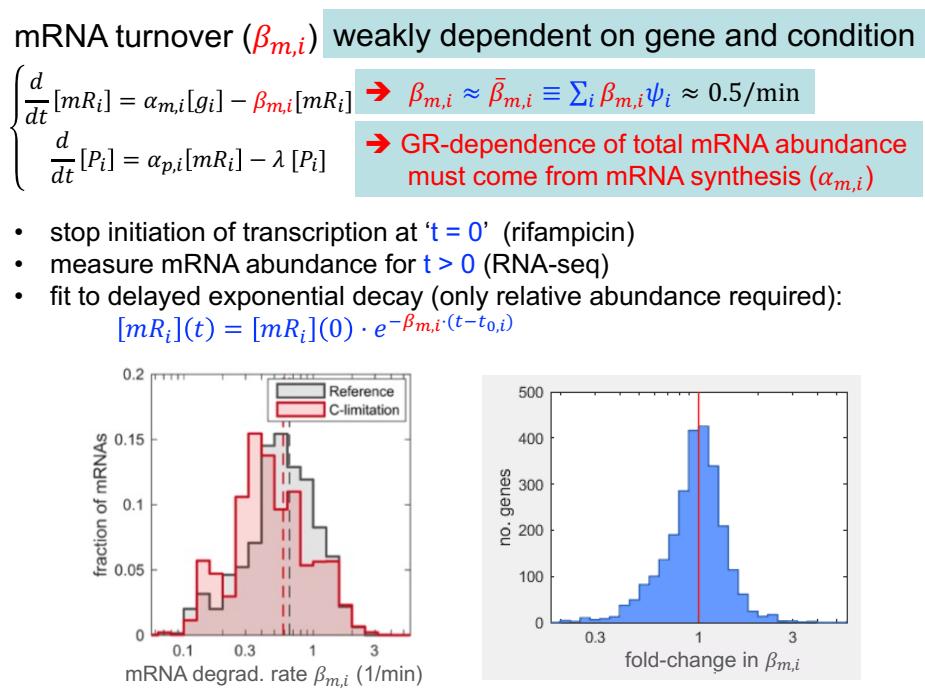
- huge burstiness typical: $\alpha_{p,i}/\beta_{m,i} \sim 20$
- post-tsx regulation
(change in mRNA turnover: signature of sRNA and protein regulation)



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focus on mRNA synthesis ($\alpha_{m,i}$):

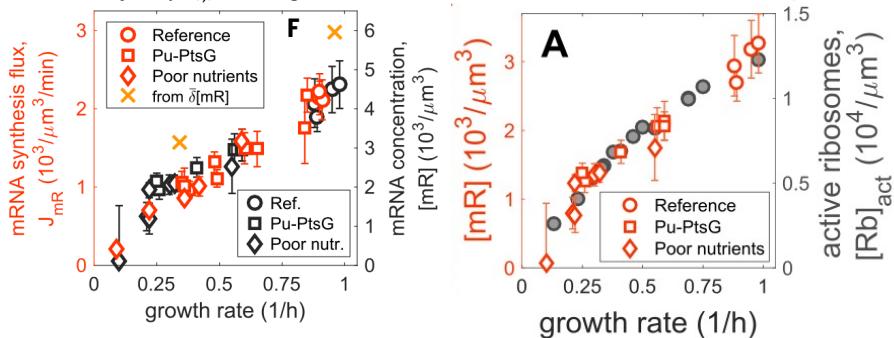
$$\begin{cases} \frac{d}{dt}[mR_i] = \alpha_{m,i}[g_i] - \beta_{m,i}[mR_i] \\ \frac{d}{dt}[P_i] = \alpha_{p,i}[mR_i] - \lambda [P_i] \end{cases}$$

steady-state: $\alpha_{m,i}[g_i] - \beta_{m,i}[mR_i]^*$

total mRNA synthesis flux:

$$J_{mR} \equiv \sum_i \alpha_{m,i}[g_i] = \bar{\beta}_m \cdot [mR]^*$$

constancy of $\bar{\beta}_{m,i}$: change in total mRNA abundance $[mR]^*$ from J_{mR}



→ total mRNA synthesis flux tuned to match the translational capacity

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focus on mRNA synthesis ($\alpha_{m,i}$):

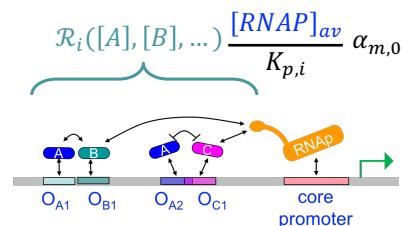
$$\begin{cases} \frac{d}{dt}[mR_i] = \alpha_{m,i}[g_i] - \beta_{m,i}[mR_i] \\ \frac{d}{dt}[P_i] = \alpha_{p,i}[mR_i] - \lambda [P_i] \end{cases}$$

steady-state: $\alpha_{m,i}[g_i] - \beta_{m,i}[mR_i]^*$

total mRNA synthesis flux:

$$J_{mR} \equiv \sum_i \alpha_{m,i}[g_i] = \bar{\beta}_m \cdot [mR]^*$$

model of transcriptional regulation:



$$\alpha_{m,i} = [RNAP]_{av} \cdot \underbrace{\alpha_{m,0} \mathcal{R}_i([A], [B], \dots)}_{K_{p,i}} / K_{p,i}$$

promoter on-rate → $k_i([A], [B], \dots)$

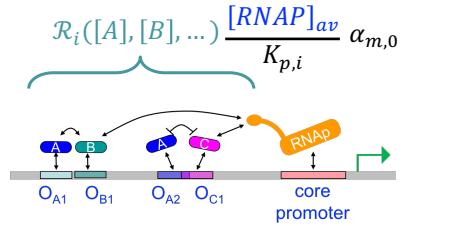
$$J_{mR} = \sum_i \alpha_{p,i}[g_i] = [RNAP]_{av} \cdot \sum_i [g_i] k_i$$

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focus on mRNA synthesis ($\alpha_{m,i}$):

$$\begin{cases} \frac{d}{dt}[mR_i] = \alpha_{m,i}[g_i] - \beta_{m,i}[mR_i] \\ \frac{d}{dt}[P_i] = \alpha_{p,i}[mR_i] - \lambda [P_i] \end{cases}$$

model of transcriptional regulation:



$$\alpha_{m,i} = [RNAP]_{av} \cdot \alpha_{m,0} R_i([A], [B], \dots) / I$$

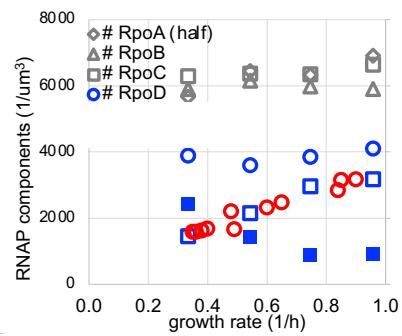
promoter on-rate $\rightarrow k_i([A], [B], \dots)$

$$J_{mR} = \sum_i \alpha_{p,i}[g_i] = [RNAP]_{av} \cdot \sum_i [g_i] k_i$$

steady-state: $\alpha_{m,i}[g_i] - \beta_{m,i}[mR_i]^*$

total mRNA synthesis flux:

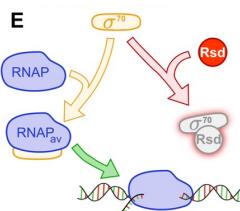
$$J_{mR} \equiv \sum_i \alpha_{m,i}[g_i] = \bar{\beta}_m \cdot [mR]^*$$



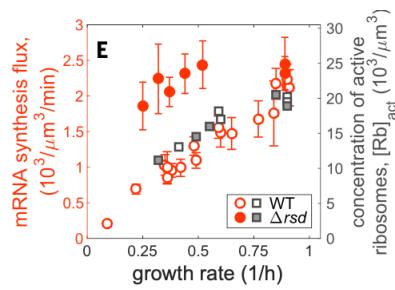
- RNAP components GR-independent
- anti- σ^D factor **Rsd** upregulated as growth slows down

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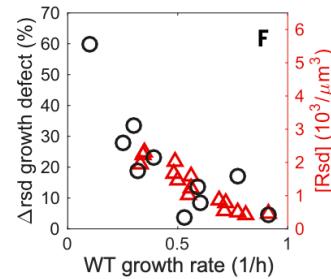
→ Rsd titrates the pool of available RNAP to match tsx output with tsl capacity



→ Rsd expression significantly affects the rate of total mRNA synthesis



→ Δrsd strain exhibits growth defect in proportion to its expression level in WT



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focus on mRNA synthesis ($\alpha_{m,i}$):

$$\begin{cases} \frac{d}{dt}[mR_i] = \alpha_{m,i}[g_i] - \beta_{m,i}[mR_i] \\ \frac{d}{dt}[P_i] = \alpha_{p,i}[mR_i] - \lambda [P_i] \end{cases}$$

constitutive expression ($k_i = \text{const}$)

steady-state: $\alpha_i[g_i] = \delta_i[mR_i]$

Summary

$$\alpha_{m,i}[g_i] = [\text{RNAP}]_{av}[g_i]k_i = \bar{\beta}_{m,i}\psi_i[mR]$$

$\Rightarrow \psi_i \propto [g_i] \cdot k_i$

$\Rightarrow \phi_i \approx \psi_i \propto [g_i] \cdot k_i$

$\Rightarrow [P_i] \propto [g_i] \cdot k_i$

i.e., protein conc set “directly” by transcriptional regulation, approximately independent of changes in growth rate

- $P_{tet}:gfp$ at *oriC* ($x_i = 0$)
- $P_{tet}:gfp$ at *terC* ($x_i = 1$)

$$\lambda T_c \approx \frac{2}{3} \cdot (0.3 + \lambda T_0), T_0 \approx 1 \text{ h}$$

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focus on mRNA synthesis ($\alpha_{m,i}$):

$$\begin{cases} \frac{d}{dt}[mR_i] = \alpha_{m,i}[g_i] - \beta_{m,i}[mR_i] \\ \frac{d}{dt}[P_i] = \alpha_{p,i}[mR_i] - \lambda [P_i] \end{cases}$$

constitutive expression ($k_i = \text{const}$)

steady-state: $\alpha_i[g_i] = \delta_i[mR_i]$

Summary

$$\alpha_{m,i}[g_i] = [\text{RNAP}]_{av}[g_i]k_i = \bar{\beta}_{m,i}\psi_i[mR]$$

$\Rightarrow \psi_i \propto [g_i] \cdot k_i$

$\Rightarrow \phi_i \approx \psi_i \propto [g_i] \cdot k_i$

$\Rightarrow [P_i] \propto [g_i] \cdot k_i$

i.e., protein conc set “directly” by transcriptional regulation, approximately independent of changes in growth rate

Global survey of relation between $[P_i]$ and k_i

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focus on mRNA synthesis ($\alpha_{m,i}$): In general,

$$\begin{cases} \frac{d}{dt}[mR_i] = \alpha_{m,i}[g_i] - \beta_{m,i}[mR_i] \\ \frac{d}{dt}[P_i] = \alpha_{p,i}[mR_i] - \lambda [P_i] \end{cases}$$

steady-state: $\alpha_i[g_i] = \delta_i[mR_i]$

“quantitative central dogma”

Summary

$\alpha_{m,i}[g_i] = [\text{RNAP}_{\text{av}}][g_i]k_i = \bar{\beta}_{m,i}\psi_i[mR]$

- $[P_i] \propto [g_i] \cdot k_i$ from fixed $\sum_i [g_i]k_i$
- approx. obtained for WT cells
- not always true for mutants

→ $\psi_i \propto [g_i] \cdot k_i$

→ $\phi_i \approx \psi_i \propto [g_i] \cdot k_i$

→ $[P_i] \propto [g_i] \cdot k_i$

i.e., protein conc set “by transcriptional regulation” approximately independent of changes in growth rate

total promoter on-rate, K

mRNA and protein abundance

$\psi_1 = \frac{k_1}{k_1 + k_2}$

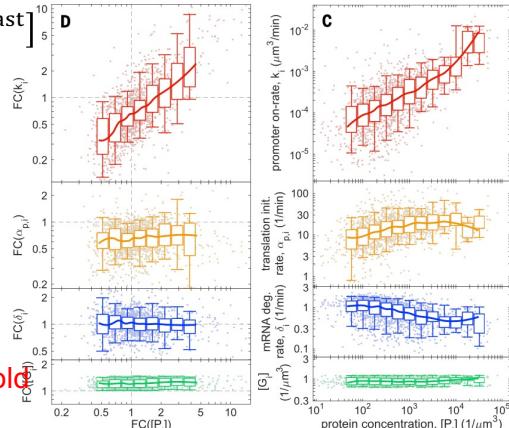
$\psi_2 = \frac{k_2}{k_1 + k_2}$

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Factors affecting protein concentrations (steady state carbon limitation)

- variation in $FC(P_i) = [P_i^{\text{slow}}]:[P_i^{\text{fast}}]$
- gene dose: negligible
 - mRNA stability: negligible
 - translational efficiency: 30%
 - **promoter on-rate: 10-fold**

- variation in $[P_i]$
- gene dose: negligible
 - mRNA stability: 2-fold
 - translational efficiency: 3-fold
 - **promoter on-rate: 100-1000 fold**



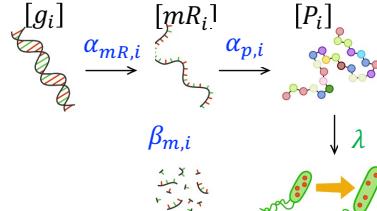
- genes “born” into different expression classes
- expression level set largely by basal promoter on-rate k_i (with help from translation eff and mRNA stability for the highest expression class)
- range in basal rates >> tsx regulation >> post-tsx regulation

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Summary: from DNA to protein

Canonical model for gene expression

$$\begin{cases} \frac{d}{dt}[mR_i] = \alpha_{mR,i}[g_i] - \beta_{m,i}[mR_i] \\ \frac{d}{dt}[P_i] = \alpha_{p,i}[mR_i] - \lambda [P_i] \end{cases}$$



steady-state:

$$[P_i] = \frac{\alpha_{p,i} [g_i] \alpha_{mR,i}}{\beta_{m,i} \lambda} = \frac{\alpha_{p,i} [RNAP]_{av} [g_i] k_i}{\beta_{m,i} \lambda}$$

Principles of gene expression (*E. coli*)

- 0) predominance of basal tsx level in defining expression classes
- 1) uniformity and constancy of mRNAs in translation and degradation
- 2) coordination of total mRNA synthesis flux with translational capacity

→ connection from promoter to protein conc: $\frac{[P_i]}{[P]} \approx \frac{[mR_i]}{[mR]} \approx \frac{k_i[g_i]}{\sum_j k_j[g_j]}$

- general promoter entanglement thru GR dependence of $\sum_j k_j[g_j]$
- Rsd as coordinator of transcription and translation
- mRNA as proxy for protein (~200nt per ribosome)
- extremely high burstiness (~20 for typical genes) [cf: Hausser et al, 2020]