

# Competing pathways control host resistance to virus via tRNA modification and programmed ribosomal frameshifting

Nathaniel D Maynard<sup>1</sup>, Derek N Macklin<sup>1</sup>, Karla Kirkegaard<sup>2</sup> and Markus W Covert<sup>1,\*</sup>

<sup>1</sup> Department of Bioengineering, Stanford University, Stanford, CA, USA and <sup>2</sup> Department of Microbiology and Immunology, Stanford University, Stanford, CA, USA

\* Corresponding author. Department of Bioengineering, Stanford University, 318 Campus Drive, Stanford, CA 94305-5444, USA. Tel.: +1 650 725 6615; Fax: +1 650 721 1409; E-mail: mcovert@stanford.edu

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**Viral infection depends on a complex interplay between host and viral factors. Here, we link host susceptibility to viral infection to a network encompassing sulfur metabolism, tRNA modification, competitive binding, and programmed ribosomal frameshifting (PRF). We first demonstrate that the iron-sulfur cluster biosynthesis pathway in *Escherichia coli* exerts a protective effect during lambda phage infection, while a tRNA thiolation pathway enhances viral infection. We show that tRNA<sup>Lys</sup> uridine 34 modification inhibits PRF to influence the ratio of lambda phage proteins gpG and gpGT. Computational modeling and experiments suggest that the role of the iron-sulfur cluster biosynthesis pathway in infection is indirect, via competitive binding of the shared sulfur donor IscS. Based on the universality of many key components of this network, in both the host and the virus, we anticipate that these findings may have broad relevance to understanding other infections, including viral infection of humans.**

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## Introduction

All viruses require host translational machinery in order to replicate. To make use of this machinery while avoiding detection, viruses have evolved a number of unconventional translational strategies (Gale *et al*, 2000), including internal ribosome entry sites (Jang *et al*, 1988), leaky scanning (Schwartz *et al*, 1990), ribosome shunting (Schmidt-Puchta *et al*, 1997), reinitiation (Hemmings-Mieszczak *et al*, 1997), and programmed ribosomal frameshifting (PRF) (Gesteland and Atkins, 1996). Many of these strategies are unique to viruses, and thus are potential antiviral targets (Harford, 1995).

During PRF, the translational machinery slips backward or forward by one nucleotide while decoding a so-called 'slippery sequence,' a heptanucleotide sequence of the form XXXYYYZ in the mRNA transcript (Figure 1). Outside of PRF, frameshifting is a rare event, occurring fewer than  $5 \times 10^{-5}$  times per codon (Kurland, 1992). PRF can increase the occurrence of frameshifting by several orders of magnitude, depending on the slippery sequence itself as well as on the presence or absence of adjacent secondary structures that favor translational pausing and increase frameshift frequency (Gesteland and Atkins, 1996). In many instances of PRF, slippage causes the translational machinery to bypass a stop codon just downstream of the slippery sequence, resulting in the expression of an elongated protein (Gesteland and Atkins,

1996). Therefore, normal expression from these transcripts results in two products, a shorter product based on the initial translation frame plus a longer product, whose ratio depends on the frequency of slippage and is thought to have evolved to a value optimized for virus production (Shehu-Xhilaga *et al*, 2001; Dulude *et al*, 2006).

PRF is an evolutionarily conserved phenomenon observed in a range of viruses, from bacteriophage to notable human pathogens (Table I; Baranov *et al*, 2002). For example, in HIV, the Gag to Gag-Pol expression ratio is regulated by PRF and is necessary for the proper loading of reverse transcriptase into the new viral capsids; disturbing this ratio can inhibit viral replication (Shehu-Xhilaga *et al*, 2001; Dulude *et al*, 2006). The role of PRF in the SARS life cycle is less clear, but is necessary for expression of its RNA-dependent RNA polymerase (Plant *et al*, 2010). In *Escherichia coli* bacteriophage lambda, PRF regulates the expression of proteins gpG and gpGT (Levin *et al*, 1993). As lambda phage genes *G* and *T* lie between its major tail gene (*V*) and its tape measure gene (*H*), they are thought to have a role in tail formation (Xu, 2001). However, proteins gpG and gpGT do not make up any of the final tail structure (Levin *et al*, 1993), and thus may act as chaperones or scaffolds for gpH, assisting in the assembly of the tail shaft around the tape measure protein (Xu, 2001).

Reading-frame maintenance is a common function of tRNA modifications (Urbonavicius *et al*, 2001). tRNAs contain

upwards of 80 known modified nucleosides (Limbach *et al*, 1994), and many of these are strongly conserved across species (Sprinzl and Vassilenko, 2005). However, their loss is generally not lethal (Alexandrov *et al*, 2006; Phizicky and Hopper, 2010). In *E. coli*, four tRNA modifications require the addition of a thiol moiety and are made via two functionally distinct mechanisms (Nilsson *et al*, 2002). The first mechanism requires proteins that contain iron-sulfur (Fe-S) clusters and includes 2-thiocytidine formation at position 32 and methylthio formation of ms2i6A at position 37 (Jager *et al*, 2004; Pierrel *et al*, 2004). The second mechanism is independent of Fe-S clusters and includes 4-thiouridine at position 8 and 2-thiouridine at position 34 (Ikeuchi *et al*, 2006). For each of these modifications, sulfur is sequestered by *E. coli*'s primary cysteine desulfurase, IscS. Sulfur is then used for one of these four tRNA modifications or for Fe-S cluster biosynthesis. In addition to their roles in tRNA modification, Fe-S clusters are critical cofactors involved in many cellular processes including respiration, central metabolism, environmental sensing, RNA modification, DNA repair, and DNA replication (Py and Barras, 2010).

We previously identified two pathways downstream of IscS in a screen to identify *E. coli* genes with a significant effect on lambda phage replication (Maynard *et al*, 2010). Specifically, lambda phage replication was inhibited following deletion of several members of the 2-thiouridine synthesis (TUS) pathway leading to 2-thiouridine modification of tRNA<sup>Lys/Glu/Gln</sup>, a pathway independent of Fe-S cluster biosynthesis. Conversely, we found that knocking out members of the Fe-S cluster biosynthesis (ISC) pathway enhanced lambda replication.

The current investigation was therefore motivated by this overarching question: how do the host's TUS and ISC pathways control viral replication? We were particularly

intrigued by the possibility that these pathways interact. Furthermore, the substantial evolutionary conservation of both host genes and viral PRF mechanism strongly suggested that our observations would have relevance beyond *E. coli* and lambda phage. Our current observations shed light on a complex network that extends from host metabolism and tRNA modification to viral translational regulation and finally to virion production. We find that 2-thiouridine hypomodification of tRNA<sup>Lys/Glu/Gln</sup> causes increased translational frameshifting, changing the ratio of the critical lambda phage proteins gpG and gpGT. We also show that IscU is linked to gpG and gpGT expression by competitive inhibition of the TUS pathway. Knocking out core members of the ISC pathway increases lambda phage replication by relieving competition for sulfur, allowing the TUS pathway to increase the rates of 2-thiouridine formation, thus reducing frameshifting. Targeting tRNA modifications to alter frameshifting rates, to which viral structural proteins are likely to be uniquely sensitive, presents a novel antiviral strategy.

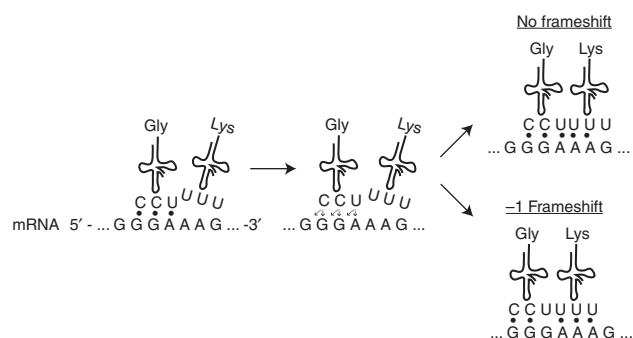
## Results

### Viral replication can be slowed by deletion of TUS and accelerated by deletion of ISC genes

In a previous genome-wide screen (Maynard *et al*, 2010), we found that plates growing TUS pathway deletion strains ( $\Delta tusA$ ,  $\Delta tusE$ , and  $\Delta mnmA$ ) infected with lambda phage produced plaques of an unusually small diameter compared with wild-type (WT) *E. coli*. In contrast, several ISC pathway deletion strains ( $\Delta iscU$ ,  $\Delta hscA$ , and  $\Delta hscB$ ) produced abnormally large diameter plaques compared with WT.

We investigated viral replication in these strains more thoroughly by culturing each strain in liquid media, in the presence and absence of virus. Without phage, WT *E. coli* grew in exponential phase for several hours, slowing and reaching stationary phase as available nutrients decreased (Figure 2A, blue line). In the presence of lambda phage, the culture exhibited three phases (gray line). First, the culture underwent exponential growth similar to the uninfected culture. After ~6 h in the WT strain, viral lysis overtook the culture and the culture began to clear (lytic phase). Lambda phage is a temperate phage with both lytic and lysogenic life cycles (Landy and Ross, 1977); as a result, after a roughly 3-h lytic phase, lysogenized bacterial population growth took over the culture.

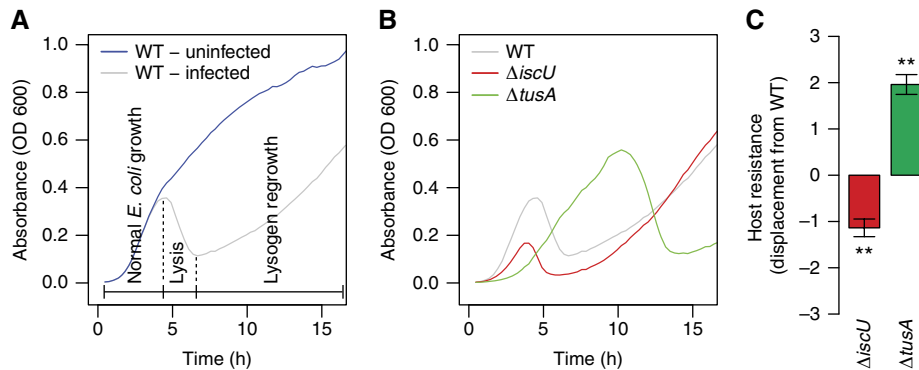
The time courses of lambda phage infection of the *tusA* and *iscU* knockout strains (the first members of the TUS and ISC pathways, respectively) differed significantly from that of WT. The  $\Delta iscU$  culture entered the lytic phase very quickly (red curve, Figure 2B), while the infected  $\Delta tusA$  strain grew in exponential phase substantially longer than the WT strain, leading to a higher turbidity before the lytic phase occurred (green curve). We therefore decided to classify strains that entered the lytic phase earlier as more susceptible to viral infection (red) and those that entered the lytic phase later as less susceptible (green). This susceptibility classification was consistent with our earlier plaque assay experiments (Maynard *et al*, 2010).



**Figure 1** Programmed ribosomal frameshifting. Schematic of a  $-1$  programmed ribosomal frameshift. P-site tRNA slips in the  $-1$  direction at the 'slippery sequence.'

**Table 1** Viruses dependent on programmed ribosomal frameshifting

Virus	Slippery sequence	Region
HIV-1	UUUUUUA	<i>gag/gag-pol</i>
SARS-CoV	UUUAAAC	<i>ORF1a/1b</i>
Lambda phage	GGGAAAG	<i>G/GT</i>



**Figure 2** Dynamics of lambda phage infection. **(A)** A typical trace of a WT *E. coli* culture infected with lambda phage. Several hours after infection, lysis begins to outpace *E. coli* growth and absorbance begins to decrease. Regrowth is due to the lambda lysogen population. **(B)** Infection dynamics of infected  $\Delta iscU$  and  $\Delta tusA$  cultures were compared. **(C)** The displacement from the WT growth curve. In **(C)**, the bars indicate the 95% confidence interval (CI). For **(A)** and **(B)**, absorbance was recorded over the course of 16 h for three biological replicates with four technical replicates for each biological replicate (\*\* $P < 0.01$ ,  $P$ -values were calculated using an independent two-sample  $t$ -test).

We then defined a metric to compare the resistance of different strains with infection with phage lambda. One useful way to summarize the information contained in a time course is to consider each experiment as a vector in  $n$ -dimensional space, where  $n$  is the number of time points taken. In earlier work, we found that it was useful to normalize these infection time course experiment vectors by the growth rate (Maynard *et al*, 2010). However, we have since found that bacterial growth and viral growth are tightly linked, and our attempts to numerically correct for or eliminate the effect of bacterial growth rate often distorted the raw data. Bacterial growth is therefore an important (but not sufficient) consideration in classifying our strains.

As a result, we determined our new metric simply by calculating the Euclidean distance between the knockout and WT strain time course vectors under infection conditions. Combining this distance with our susceptibility classification, we obtain a displacement vector that points in a negative direction for strains that are less resistant to virus and a positive direction for more resistant strains. The displacement vector, which we call the 'host resistance', enables us to compare the magnitude and direction of each strain relative with the WT strain and with each other. For example, the  $\Delta iscU$  strain is significantly less resistant to viral infection than the WT strain, while the  $\Delta tusA$  strain is more resistant (Figure 2C).

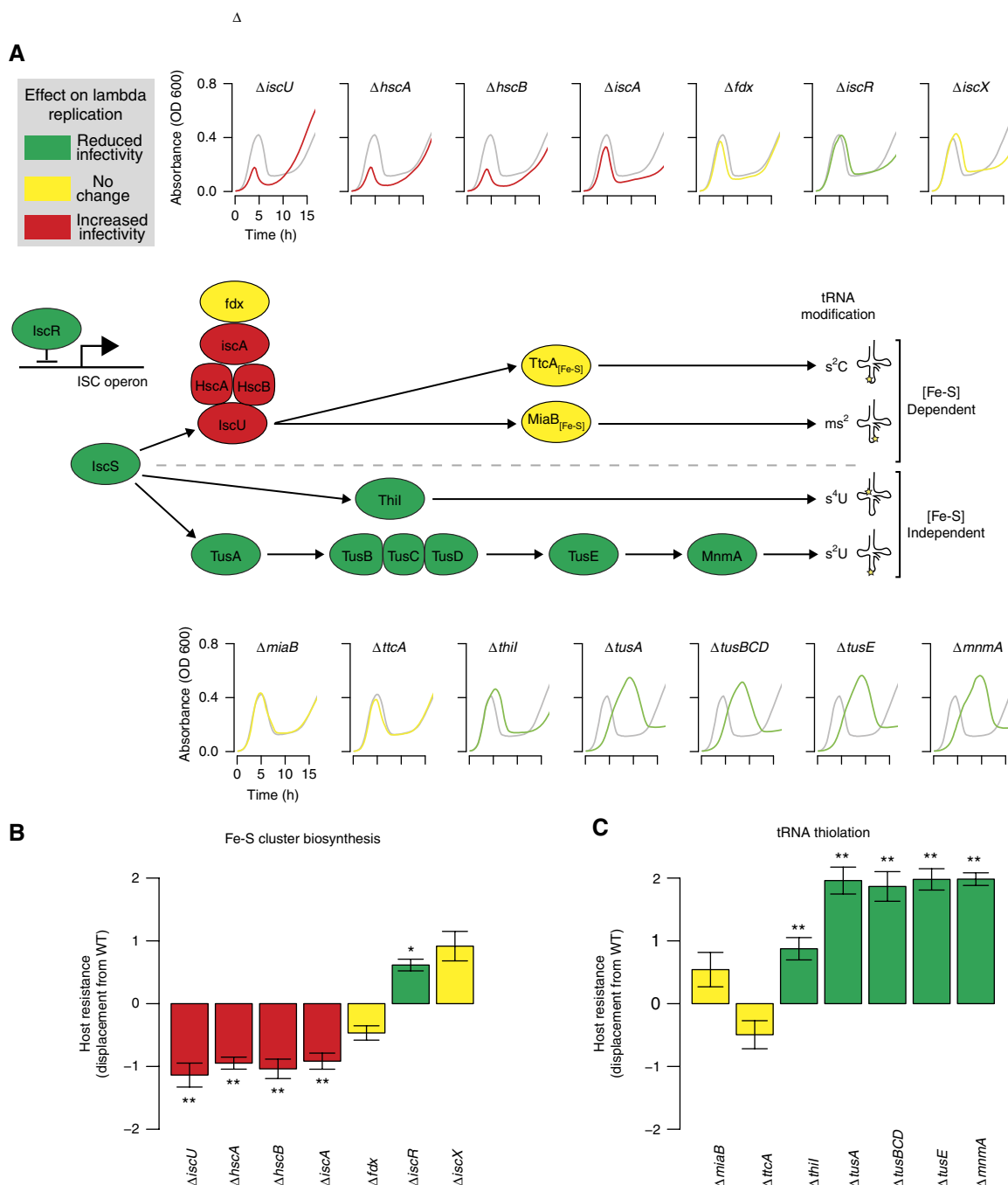
### Deletion mutants in Fe-S biosynthesis and tRNA thiolation exhibit altered viral infection dynamics

As both the TUS and ISC pathways are linked to sulfur metabolism through IscS, we wondered about the interplay between these two pathways and what might be the mechanistic basis for their effect on lambda replication. We began our investigation by examining the impact of other known ISC and TUS pathway members on lambda phage replication (Figure 3A; see Supplementary Figure 1 for line plots of individual replicates). First, we investigated the effect on lambda phage replication of several genes associated with Fe-S cluster biosynthesis. We performed infection time courses of  $\Delta iscU$  and other strains deficient in members of the *iscRSUA*-

*hscBA-fdx-iscX* operon (*hscA*, *hscB*, *iscA*, *iscR*, *fdx*, and *iscX*). The slow growth of the *iscS* deletion strain made it impossible to assess infection dynamics and was not included in the analysis. The  $\Delta iscU$ ,  $\Delta hscA$ , and  $\Delta hscB$  strains all exhibited very similar infection dynamics, clearing the culture significantly before WT (Figure 3A, top row; Figure 3B). IscU is the primary scaffolding protein used for Fe-S cluster biosynthesis (Urbina *et al*, 2001), and HscA and HscB are accessory proteins that help transfer Fe-S clusters to apoproteins (Bonomi *et al*, 2008). The  $\Delta iscA$  strain exhibited increased replication efficiency, but less than the *hscA*, *hscB*, and *iscU* gene deletions (Figure 3A and B). IscA assists in Fe-S cluster biosynthesis by shuttling iron to IscU (Yang *et al*, 2006).

Deletion strains for the remaining three genes in the operon, *iscR*, *fdx*, and *iscX*, displayed little if any change in viral infection dynamics from WT (Figure 3A and B). The roles of Fdx and IscX in Fe-S cluster biosynthesis are not known (Takahashi and Nakamura, 1999), but IscR is the transcriptional repressor of the ISC operon and its active form includes an Fe-S cluster (Schwartz *et al*, 2001). Interestingly, lambda phage replication is slightly but significantly hindered in the *iscR* knockout strain (Figure 3A and B). Taken together, these observations suggest that ISC pathway members IscU, HscA, HscB, IscA, and possibly IscR have a more significant role in lambda phage infection than Fdx or IscX, and that their WT function helps to restrict phage growth.

We next determined how deletion of tRNA thiolation enzymes affected viral susceptibility of the host. We began with the Fe-S cluster-containing enzymes encoded by *miaB* and *ttcA*. MiaB is responsible for methylthio formation of ms2i6A at position 37 in tRNA<sup>Phe</sup> (Pierrel *et al*, 2004); a sulfur donor for MiaB has not been identified. TtcA catalyzes the 2-thiocytidine modification at position 32 of tRNA<sup>Arg</sup>(ICG), tRNA<sup>Arg</sup>(CCG), tRNA<sup>Arg</sup>(mnm5UCU), and tRNA<sup>Ser</sup>(CGU) (Jager *et al*, 2004).  $\Delta ttcA$  strains displayed doubling times equivalent to WT *E. coli* (Figure 3A, bottom), and little is known about the functional consequences of modification. Strains lacking either of these genes showed no effect on lambda infection dynamics (Figure 3A, bottom; Figure 3C). In contrast, deletion strains for the two Fe-S cluster-independent tRNA thiolation enzymes ThiI and MnmA displayed a

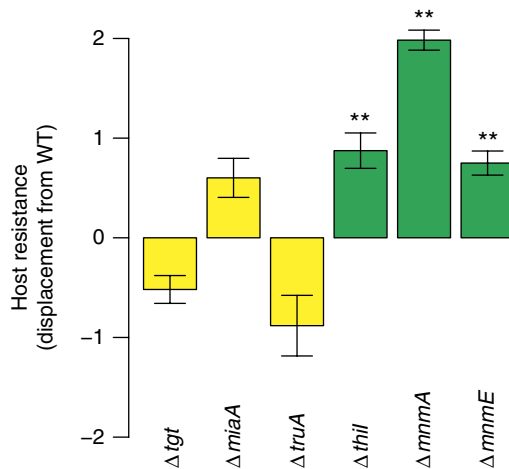


**Figure 3** The effects of Fe-S cluster and tRNA thiolation deletions on lambda phage infection dynamics. **(A)** Cell-culture dynamics following infection overlay the uninfected control data (WT alone, gray). Small arrows in the cartoon indicate sulfur transfer and the large bent arrow indicates expression of the ISC operon. **(B)** Displacement from the WT strain for ISC operon members ( $*P < 0.05$ ,  $**P < 0.01$ , bars indicate 95% CI,  $P$ -values were calculated using independent two-sample  $t$ -test). **(C)** Comparison of the displacement from the WT strain for tRNA thiolation pathway members. Source data is available for this figure in the Supplementary Information.

significant increase in viral resistance versus the WT strain (Figure 3A, bottom; Figure 3C). Sulfur is transferred to ThiI through direct binding of IscS (Kambampati and Lauhon, 2000), and ThiI then transfers the sulfur to s4U8 of tRNA<sup>Phe</sup>. Lambda replication in the  $\Delta thiI$  strain was mildly but significantly inhibited (Figure 3A, bottom; Figure 3C).

The  $\Delta mnmA$  strain exhibited the most dramatic effect on viral infection of all the strains associated with tRNA thiolation. MnmA catalyzes 2-thiouridination at position 34

of several tRNAs (Kambampati and Lauhon, 2003). Sulfur is supplied to MnmA through the TUS pathway, beginning with the direct binding of IscS by TusA (Ikeuchi *et al*, 2006). The  $\Delta mnmA$  strain underwent infection dynamics (Figure 3A, bottom; Figure 3C) very similar to the upstream TUS pathway gene deletion strains we characterized in a previous study (Maynard *et al*, 2010), including  $\Delta tusA$ ,  $\Delta tusBCD$ , and  $\Delta tusE$ . All members of the TUS pathway had a strong, significant, and similar effect on lambda replication (Figure 3A and C), leading



**Figure 4** Displacement vector comparisons for mutants in *E. coli* genes known to affect frameshifting. Comparison of the displacement from the WT for deletion mutants in genes known to affect frameshifting (\*\* $P < 0.01$ , bars indicate 95% CI,  $P$ -values were calculated using independent two-sample  $t$ -test). Green, reduced infectivity; yellow, no effect on infectivity. Source data is available for this figure in the Supplementary Information.

us to conclude that Fe-S cluster-independent tRNA thiolation in *E. coli* exerts a significant effect on lambda phage replication through the TUS pathway and, to a lesser degree, ThiI.

### Changes in tRNA modification and frameshifting propensity inhibit viral replication

Based on the preceding data and a previous observation of increased frameshifting in  $\Delta mnmA$  strains (Urbonavicius *et al*, 2001), we hypothesized that reduced lambda replication in the TUS knockouts was due to increased frameshifting during lambda protein synthesis as a result of the decreased tRNA modification. To test this hypothesis, we generated infection curves for several deletion mutants that have been shown to affect frameshifting by loss of tRNA modification, including *tgt*, *truA*, *miaA*, *thiI*, and *mnmE* (Urbonavicius *et al*, 2001). We infected deletion strains for these genes with lambda phage and determined their susceptibility to infection (Figure 4; see Supplementary Figure 2 for line plots of individual replicates).  $\Delta tgt$ ,  $\Delta miaA$ , and  $\Delta truA$  exhibited no significant affect on lambda phage replication, suggesting that the tRNA modifications from these enzymes have no role in lambda phage replication. The remaining knockout strains displayed significant changes in lambda phage's ability to infect the host, including  $\Delta thiI$ ,  $\Delta mnmA$  (Figures 3 and 4), and  $\Delta mnmE$  (Figure 4). Intriguingly, MnmE performs a methylamino-methyl modification on carbon 5 of the same tRNA species and nucleoside targeted by MnmA (Elseviers *et al*, 1984), suggesting that the antiviral properties of the TUS pathway knockouts may be due to specific tRNA modifications instead of to general translational fidelity issues.

### Codon usage bias does not underlie differential infection dynamics

Host-preferred codon usage is common among many viruses and their hosts (Kunisawa *et al*, 1998; Lucks *et al*, 2008). We wondered whether the lambda genome used the codons

**Table II** Codon usage in *E. coli* and lambda phage

Amino acid	Codon	<i>E. coli</i> : fraction (number)	Lambda phage: fraction (number)
Lysine	AAA	0.76 (46 116)	0.65 (486)
	AAG	0.24 (14 174)	0.35 (262)
Glutamic acid	GAA	0.69 (54 431)	0.57 (515)
	GAG	0.31 (24 629)	0.43 (385)
Glutamine	CAA	0.35 (21 121)	0.20 (117)
	CAG	0.65 (39 836)	0.80 (459)

whose tRNAs are modified by the *mnmA*, and *mnmE* gene products preferentially with respect to *E. coli*. The tRNA species modified by MnmA and MnmE decode the lysine, glutamic acid, and glutamine codons (Kambampati and Lauhon, 2003); we examined the codon usage for lysine, glutamic acid, and glutamine in lambda phage and in *E. coli* for synonymous codon usage bias. Lambda phage encodes lysine 748 times (65% AAA and 35% AAG), glutamic acid 900 times (57% GAA and 43% GAG), and glutamine 576 times (20% CAA and 80% CAG), with similar biases in *E. coli* (Table II). This similarity in codon usage does not support the hypothesis that lambda phage protein synthesis is any more impaired in strains harboring hypomodified 2-thiouridine tRNAs than its host.

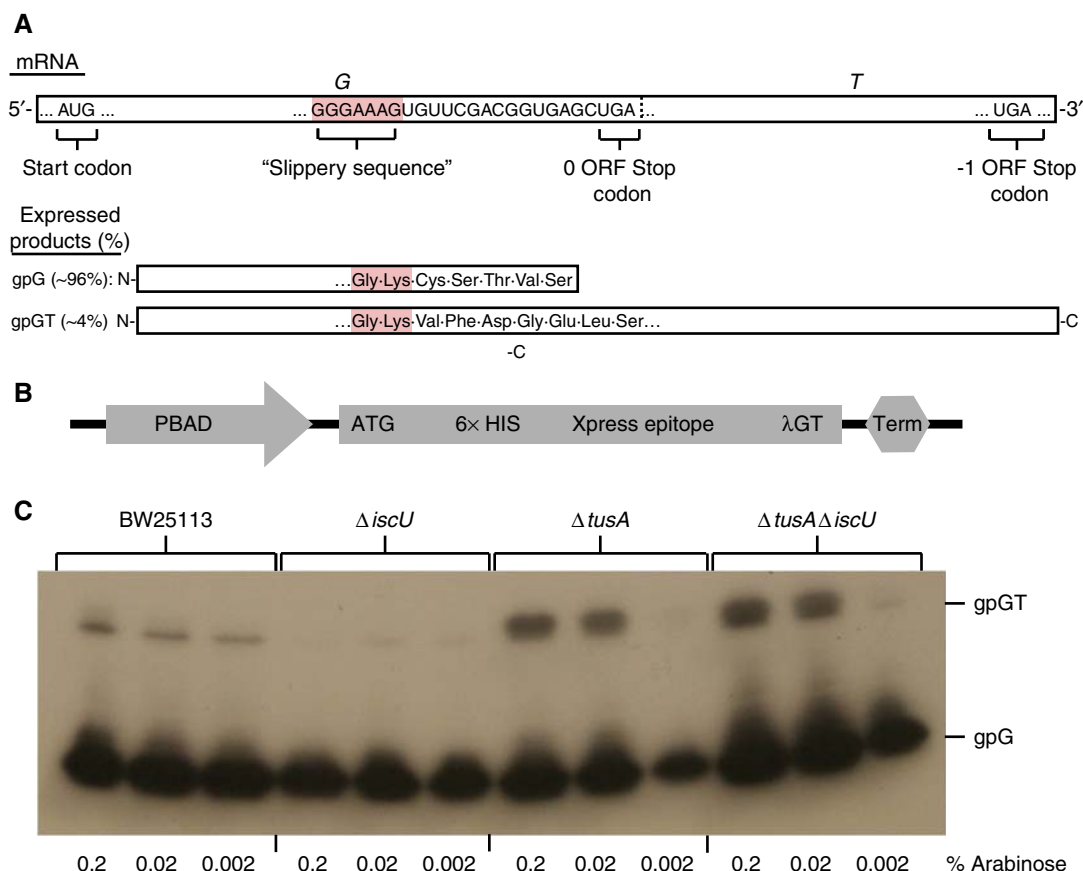
### Thiolation of tRNA<sup>Lys</sup> (UUU) and frameshifting via PRF are linked through a genetic network

Since we thought it unlikely that lambda phage replication was being significantly affected by general reading frame maintenance in the TUS pathway knockout mutants, we turned instead to specific tRNA modifications that could explain our observations of an increase in viral resistance. In particular, our attention was drawn to PRF as a specific instance of frameshifting that could be particularly sensitive to changes in frameshifting frequency.

In lambda phage, PRF occurs during translation of the lambda phage *GT* region, which encodes two possible protein products, either gpG or gpGT; expression of gpGT depends on ribosomal frameshifting at the slippery sequence GGGTTG (Levin *et al*, 1993). This sequence encodes the dipeptide Gly-Lys in both the 0 open reading frame (ORF; GGT-TTG) and the -1 ORF (GGG-TTT). In the 0 ORF, which is maintained ~96% of the time, gpG is expressed (Figure 5A); and in the remaining cases, the ribosomal machinery reaches the slippery sequence and slips back one base pair. As a result, the stop codon for gpG, immediately downstream of the slippery sequence, is bypassed and the larger gpGT product is produced. Interestingly, both the lysine codons TTG (0 ORF) and TTT (-1 ORF) are decoded by the same tRNA<sup>Lys</sup> (UUU), a target of MnmA and MnmE. We therefore wondered whether TUS pathway gene deletion strains would exhibit an altered rate of frameshifting and consequently a change in the ratio of gpG to gpGT.

To monitor gpG and gpGT expression in *E. coli*, we created a plasmid for the inducible synthesis of these proteins (pBAD- $\lambda GT$ ; Figure 5B). We PCR amplified the *GT* region of the lambda genome and introduced this region behind an arabinose-inducible promoter, to control expression of the transcript, and





**Figure 5** Lambda phage proteins gpG and frameshift product gpGT. **(A)** Schematic of lambda phage's frameshifting region in G and T. **(B)** Schematic of the arabinose-inducible region of the pBAD-λGT vector. **(C)** Immunoblotting of pBAD-λGT in BW25113, ΔiscU, ΔtusA, and ΔtusAΔiscU strains. We induced expression of the pBAD-λGT transcript with 0.2, 0.02, or 0.002% L-arabinose for 2 h and assessed the gpG and gpGT protein levels by immunoblotting against the Xpress Epitope tag. We found a decrease in gpGT levels in ΔiscU and an increase in ΔiscU and ΔtusAΔiscU.

the Xpress Epitope C-terminal tag, to facilitate detection by immunoblotting. We then transformed WT, ΔtusA, ΔiscU, and ΔtusAΔiscU strains with pBAD-λGT. Deletion of the *iscU* gene led to abrogation of frameshifting, whereas frameshifting frequency increased in both the ΔtusA and the ΔtusAΔiscU strains relative to WT (Figure 5C). We also tested frameshifting frequency for additional strains (ΔmnmA, ΔthiL, ΔmiaB, ΔttcA, ΔhscA, ΔhscB, Δfdx, ΔiscA, and ΔiscR) and found frameshifting levels to be consistent with infection dynamics (see Supplementary Figure 3). We interpret these results to signify that the decreased thiolation of tRNA<sup>Lys</sup> (UUU) in the TUS pathway knockout strains leads to an increase in frameshifting at the slippery sequence.

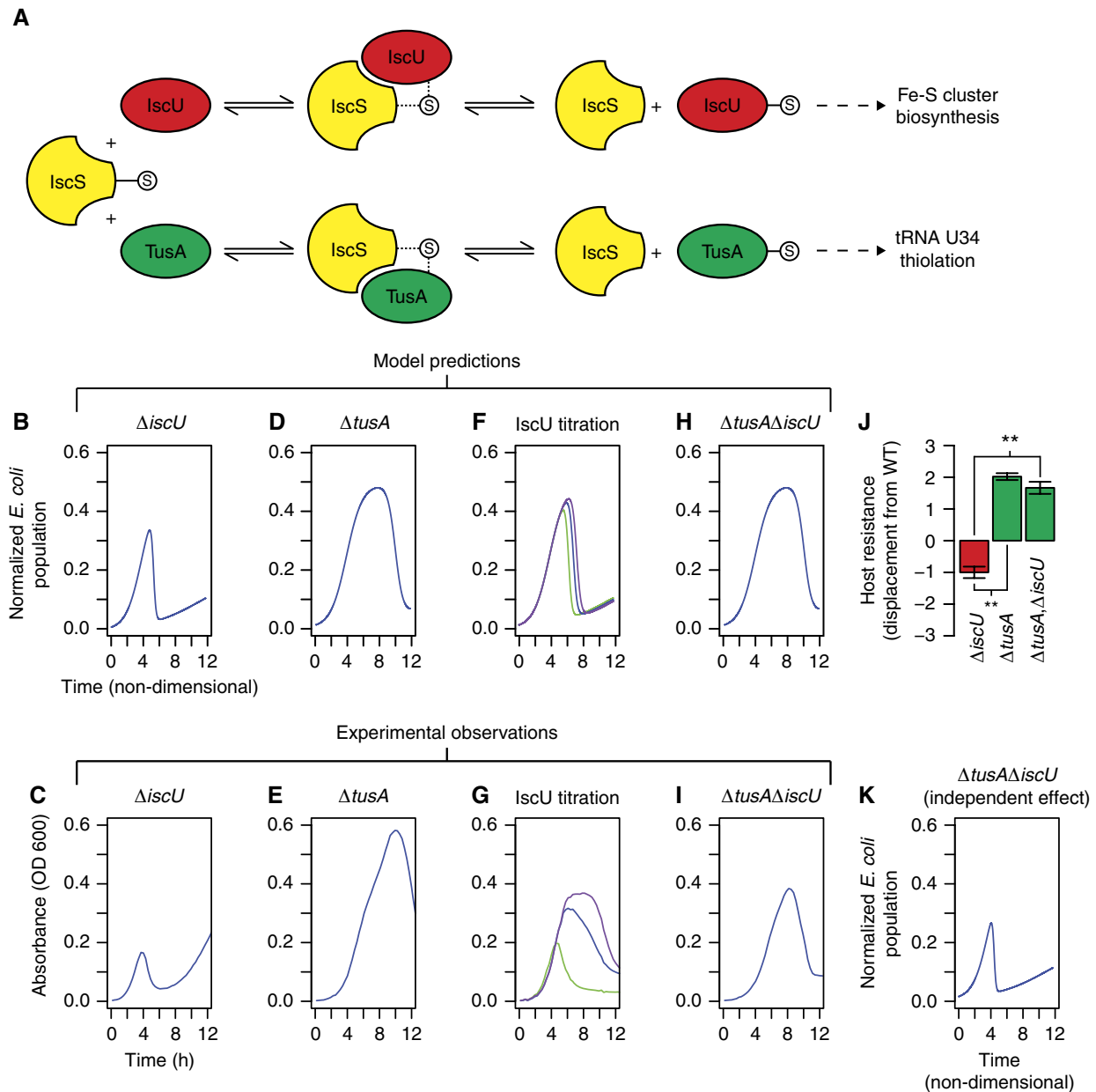
### Competitive binding of IscU and TusA for IscS binding integrates sulfur metabolism and infection dynamics

Surprisingly, the ΔiscU strain exhibited markedly reduced gpGT levels relative to the WT strain (Figure 5C), strongly indicating that both IscU and TusA act on lambda phage replication by altering the gpG:gpGT ratio. Furthermore, our observation that the *miaB* and *ttcA* deletion strains exhibited normal lambda phage replication (Figure 3) suggested that

IscU does not act directly through thiolation of specific tRNA modifications. How, then, does IscU influence viral replication independent of direct tRNA modification?

One possible answer is that IscU competes with TusA to bind IscS. Recent X-ray crystallography studies showed that IscU and TusA bind IscS at distinct but adjacent locations (Shi *et al*, 2010). Superposition of the IscU and TusA structures indicated a spatial overlap between the volume occupied by TusA and IscU when bound to IscS. Furthermore, three-way pull-down experiments demonstrated that IscS may bind either TusA or IscU individually, but not both at the same time (Shi *et al*, 2010). To further explore the possibility that thiolation of tRNA<sup>Lys</sup> (UUU) is affected by competition between TusA and IscU for sulfur transfer from IscS, we constructed a mathematical model of IscU and TusA binding to IscS (Figure 6A). Our model consisted of a set of equilibrium and mass conservation relationships. In this case, the model parameters had either been previously measured or were not difficult to estimate based on existing data (Urbina *et al*, 2001; Taniguchi *et al*, 2010). Our model predicts the relative amount of U34 thiolation from the TUS pathway for a specified amount of IscU.

We combined this protein binding model with our previous mathematical model of *E. coli* infection by lambda phage (Maynard *et al*, 2010). Our earlier model predicts the *E. coli*



**Figure 6** Competitive binding of IscU and TusA to IscS: theory and experiment. **(A)** A schematic of our competitive binding model. IscS may bind and transfer sulfur to either IscU or TusA, leading to production of Fe-S cluster biosynthesis or thiolated tRNA, respectively. **(B–I)** Comparison of model predictions (top row) and experimental observations (bottom row) of infection time courses. The genetic perturbations include the deletion mutant strains  $\Delta iscU$  (**B**, **C**) and  $\Delta tusA$  (**D**, **E**), titration of expression from *iscU* (**F**, **G**) and the double deletion mutant strain  $\Delta tusA \Delta iscU$  (**H**, **I**). **(J)** The host resistance metric calculated for the  $\Delta tusA$ ,  $\Delta iscU$ , and  $\Delta tusA \Delta iscU$  deletion mutant strains (\*\* $P < 0.01$ , bars indicate 95% CI,  $P$ -values were calculated using independent two-sample  $t$ -test). **(K)** The prediction of an alternate model—independent effect of IscU and TusA on viral biosynthesis—for an infection time course in the  $\Delta tusA \Delta iscU$  background. Comparison of this plot with (**H**) and (**I**) indicates that the competitive binding model is better able to account for the experimental observations. Source data is available for this figure in the Supplementary Information.

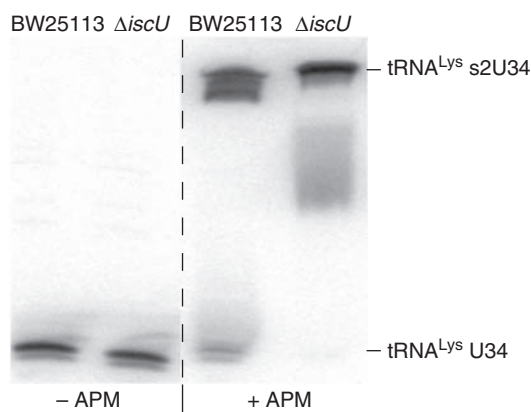
time course dynamics of lambda phage infection based on three parameters: the fraction of infections that are lytic instead of lysogenic, the rate of infection, and the burst size (how many functional progeny are released upon lysis). To integrate these two models, we related U34 thiolation (the output of the protein binding model) to the burst size (input for our infection model). We were thus able to explore the effect of changing the IscU or TusA concentration on the production of functional phage and the resulting infection time course. We first tested the integrated model's ability to predict the

outcome of deleting *iscU* or *tusA*, and in both cases the model was able to capture the infection time course (Figure 6B–E; see Supplementary Figure 4 for line plots of individual replicates). We also considered titration of IscU experimentally as well as computationally by introducing an IPTG-inducible *iscU* gene construct into a  $\Delta iscU$  strain and determining the infection time courses under various IPTG concentrations. The effect of IscU titration was predicted well by our competitive inhibition model (Figure 6F and G; see Supplementary Figure 4 for line plots of individual replicates).

Finally, we considered the case of a double deletion of *tusA* and *iscU*. The competitive inhibition model suggested that the double mutant would behave in a manner similar to a  $\Delta$ *tusA* strain under infection conditions (Figure 6H). Again, this prediction agreed with the experimental time course (Figure 6I and J; see Supplementary Figure 4 for line plots of individual replicates), as well as our experimental observation that the ratio of gpGT to gpG in the double mutant was similar to that observed in the  $\Delta$ *tusA* strain, but not in the  $\Delta$ *iscU* strain (Figure 5C).

As a control, we compared the predictions of the competitive inhibition model with those of the alternative hypothesis that IscU and TusA influence viral infection independently. This hypothesis required some relatively simple modifications in the equations and parameters of our competitive binding model (Materials and methods). Our independent effect model was able to capture the results of *tusA* deletion, *iscU* deletion, and IscU titration as accurately as the competitive inhibition model (data not shown). However, the independent effect model was not able to predict the behavior of the double knockout strain (Figure 6K).

Our competitive inhibition model predicts that the removal of IscU, one of TusA's primary competitors for sulfur, will cause an increase in the fraction of 2-thiolation modified U34 tRNA<sup>Lys</sup>(UUU) relative to BW25113. To directly measure the fraction of thiolated tRNA<sup>Lys</sup>(UUU), we performed an [(N-Acryloylamino)phenyl] mercuric chloride (APM) northern blot (Figure 7), which specifically retards the migration of the thiolated tRNA fraction (Igloi, 1988). We found a small fraction of hypomodified tRNA<sup>Lys</sup> in BW25113, and as predicted by the competitive inhibition model, loss of IscU in the  $\Delta$ *iscU* strain decreased this fraction even further. We therefore conclude that our competitive inhibition model, but not our independent effect model, is sufficient to explain the effect of TUS and ISC pathway knockouts on lambda phage replication.



**Figure 7** APM northern blot of tRNA<sup>Lys</sup>(UUU) in BW25113 and  $\Delta$ *iscU*. tRNA northern blots for tRNA<sup>Lys</sup>(UUU) in urea denaturing gels with and without APM. tRNA extracts were probed to determine the thiolated fraction of U34 in BW25113 and  $\Delta$ *iscU*. A relative shift in the APM+ gel reflects the fraction of 2-thiolated U34 tRNA<sup>Lys</sup> (tRNA<sup>Lys</sup> s2U34). A small but detectable level of hypomodified tRNA<sup>Lys</sup> (tRNA<sup>Lys</sup> U34) was seen in BW25113 but was essentially undetectable in  $\Delta$ *iscU*.

## Discussion

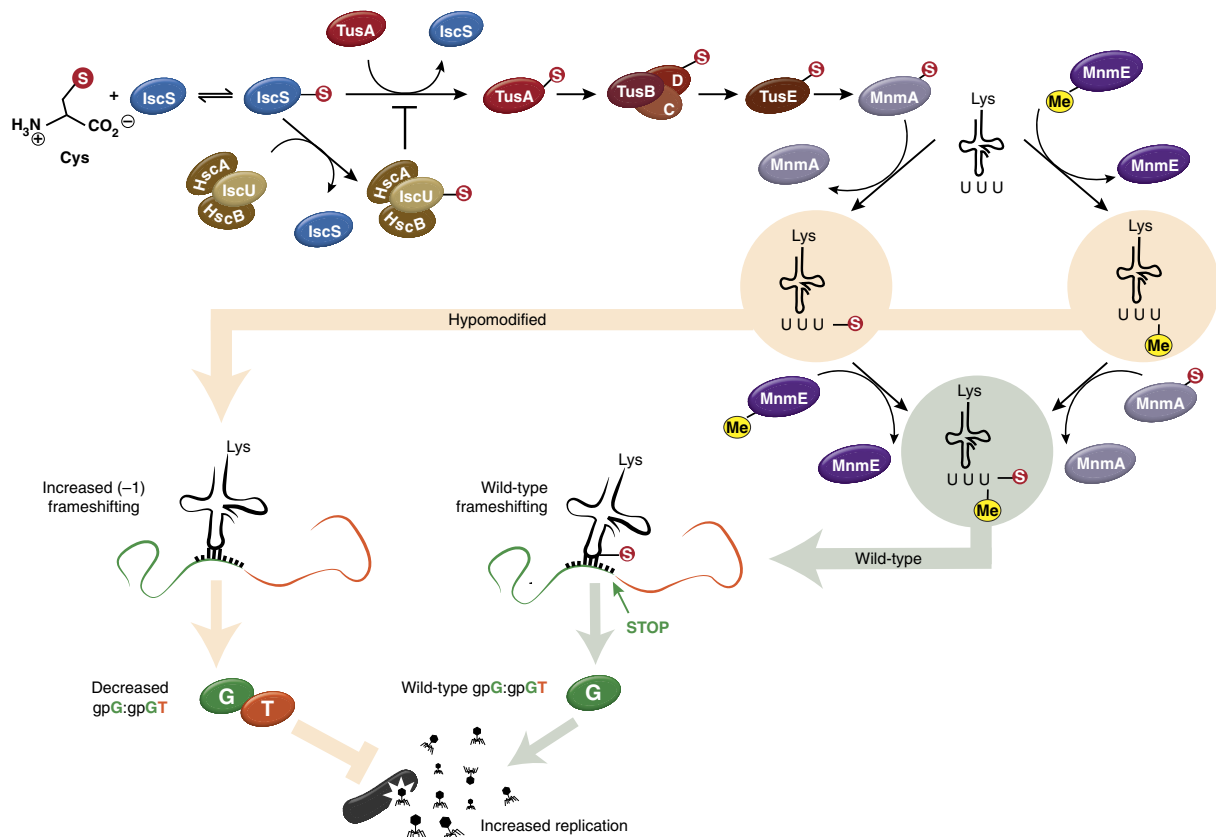
Taken together, our observations suggest the existence of a complex network that links sulfur metabolism, tRNA modification, competitive binding, and PRF-based regulation of viral protein expression with host susceptibility to viral infection (Figure 8). TusA obtains sulfur from the cysteine desulfurase IscS, and passes it along the TUS pathway for eventual modification of tRNA<sup>Lys</sup>(UUU) at U34. The fraction of tRNA<sup>Lys</sup>(UUU) that undergoes this modification influences the frequency of PRF in lambda phage due to its role in decoding part of the slippery sequence within its GT region. Although lambda phage requires both gpG and gpGT for normal replication, the gpG:gpGT ratio must be kept high. Deletion of any member of the TUS pathway prevents modification of tRNA<sup>Lys</sup>(UUU), and subsequently increases frameshifting, both decreasing the gpG:gpGT ratio and lambda phage production.

In the presence of HscA, HscB, and (less critically) IscA, IscU binds IscS more strongly than TusA (Shi *et al*, 2010) and is therefore able to outcompete TusA for sulfur. When IscU, HscA, HscB, or IscA is removed from the system, TusA obtains more sulfur than normal, leading to hypermodification of tRNA<sup>Lys</sup>(UUU), a decrease in frameshifting, and increases in the gpG:gpGT ratio and lambda phage production. Previous investigations in *B. subtilis* reported that disrupting the function of IscU affects several levels of tRNA modifications, including an increase in 2-thiolation of U34 (Leipuvienė *et al*, 2004); our observations suggest that in the case of tRNA<sup>Lys</sup>(UUU), this effect is a result of an increase of sulfur flux through the TUS pathway (Figures 5C, 6K, and 7). Removal of the transcriptional repressor IscR leads to an increase in protein production from the ISC operon (Schwartz *et al*, 2001), reducing the amount of sulfur available to TusA. This competition effect depends on an intact TUS pathway, which is why the  $\Delta$ *tusA* $\Delta$ *iscU* deletion mutant expresses a phenotype similar to the  $\Delta$ *tusA* strain.

This model fits our observations well, but unresolved issues remain, most notably the role of ThiI in viral infection. ThiI would seem to be another possible competitor for sulfur from IscS (Figure 2A). However, the  $\Delta$ *thiI* strain exhibited decreased lambda replication, albeit somewhat less strongly than the TUS pathway deletion strains. One clue to this mystery may reside with the CyaY protein, which is thought to be an iron donor for Fe-S cluster assembly, forming a ternary complex with IscU and IscS (Shi *et al*, 2010). The binding site for ThiI on IscS overlaps substantially with CyaY (Shi *et al*, 2010), and it is conceivable that in the absence of ThiI, CyaY is able to interact more efficiently with IscU, either stabilizing the IscS-IscU-CyaY complex or assisting sulfur transfer to IscU. In either case, deleting *thiI* may increase IscU's ability to compete with TusA for sulfur.

Our findings point to several novel antiviral strategies and targets. Although this work was performed using *E. coli* and phage lambda, many of the key elements of the network we describe are conserved in other systems, in both in host and the virus. Both Fe-S clusters and tRNA modifications are ubiquitous in cells (Limbach *et al*, 1994; Py and Barras, 2010) and PRF is a common viral translational strategy (Gesteland and Atkins, 1996). Indeed, frameshifting has already been





**Figure 8** A network linking host resistance to viral infection to sulfur metabolism, tRNA modification, PRF, and competitive protein binding. IscS obtains sulfur from L-cysteine and passes it to either Tusa or IscU. From Tusa, the TUS pathway leads to thiolation by MnmA of tRNA<sup>Lys</sup> (UUU) U34, which is also methylated by MnmE. During viral infection, the WT amount of modified tRNA leads to normal translation (and frameshifting) for the viral G and T genes, and consequently a favorable ratio of gpG:gpGT and virion production. Hypomodification of tRNA<sup>Lys</sup> (UUU), whether by deletion of *mnmE* or the TUS pathway genes, or by overexpression of IscU, leads to increased frameshifting during translation of G and T. This increase in frameshifting leads to more gpGT expression and subsequently, a lower gpG:gpGT ratio and decreased virion production.

identified as a potential target in HIV, but efforts to target the *gag-pol* mRNA secondary structure have been challenging (Hung *et al.*, 1998). Our results point to upstream (e.g., tRNA modifying enzymes) and even indirect targets (e.g., Fe-S cluster biosynthesis pathways), which can just as potently alter infection and in some cases are tunable (Figure 6G). We therefore anticipate that our observations and inferences may have broad relevance to understanding other infections, including viral infection of humans.

## Materials and methods

## Strains

The *E. coli* strains used in this study were all taken or derived from the Keio Collection, a comprehensive library of single gene deletion strains (Baba *et al*, 2006). BW25113 is the parental strain used for the construction of the Keio Collection. Lambda phage was obtained from the ATCC (23724-B2). The  $\Delta$ tusBCD strain was generated previously (Maynard *et al*, 2010), and the  $\Delta$ tusA $\Delta$ iscU double knockout strain was constructed according to the Datsenko-Wanner method (Datsenko and Wanner, 2000). Primer sequences are available upon request. The lambda *GT* reporter strain was constructed using a pBAD/His A plasmid (Invitrogen, Cat# V430-01). The lambda phage *GT* region was amplified via PCR (primers: 5'-cacattctcgagatgttctctgaaacccaatca-3' and 5'-gtgataaagctgcacatccggaactctct-3'). The amplified *GT* region

and pBAD/His A plasmid were cut with *Xho*I and *Hind*III. BW25113,  $\Delta$ tusA,  $\Delta$ iscU, and  $\Delta$ tusA $\Delta$ iscU strains were transformed with the arabinose-inducible lambda phage GT reporter construct (Figure 5B). A chemically inducible  $\Delta$ iscU strain was created by transforming  $\Delta$ iscU with pCA24N-iscU isolated from the ASKA collection (Kitagawa *et al*, 2005).

## Cell culture quantification

We monitored infection dynamics using an incubated plate reader (Perkin-Elmer Victor3, 2030-0030) under growth conditions described previously (Maynard *et al*, 2010). Exponentially growing cells were normalized to 0.1 OD 600 nm. Fifteen microliters of 0.1 OD *E. coli* and 15  $\mu$ l of  $\sim 10^4$  plaque forming units (p.f.u.)/ml lambda stock were added to 170  $\mu$ l of LB medium in 96-well plates, representing a multiplicity of infection of  $\sim 2 \times 10^{-4}$  p.f.u./bacteria. Each plate contained four technical replicates of infected and uninfected samples. The plate reader measured the absorbance of the culture approximately every 17 min for 16 h. Each plate contained a sample of BW25113 for between-plate normalization. Three independent biological replicates were performed for each strain.

### Comparative metrics for time courses

Time courses were compared based on a useful displacement metric that includes a direction in addition to a distance. The distance was determined by calculating the Euclidean distance between the two

time course vectors; the Euclidean distance between the recorded absorbances for each culture were calculated at each time point, and these distances were summed for all time points. For our purposes, the direction could only hold two values,  $+/-1$ . The positive value was associated with strains exhibiting increased resistance to viral infection, and the negative value was associated with increased susceptibility to viral infection. The direction was determined by the difference in the time it took a culture to reach its peak absorbance. For example, time courses with longer times to peak compared with BW25113 were considered to be displaced in a positive direction from BW25113. The displacement was then calculated as (direction)  $\times$  (distance).

The Euclidean distance from BW25113 was measured for each biological replicate. Statistical significance was determined using a two-sample *t*-test comparing the Euclidean distances calculated for each biological replicate and its distance from BW25113 for each plate containing the strain being compared.

### *E. coli* and lambda phage codon usage

Lambda phage ORFs were extracted from NCBI Reference Sequence NC\_001416.1 (Enterobacteria phage lambda, complete genome) and codon usage was tallied.

Codon usage for WT *E. coli* (W3110) was determined from the Codon Usage Database (<http://www.kazusa.or.jp/codon/>).

### Assaying lambda PRF

pBAD- $\lambda$ GT-transformed cells were cultured overnight at 37°C in LB and the appropriate antibiotics. The cultures were diluted 1:50 into fresh LB the following morning and placed back in the shaker for 1 h. The culture was then split into 1 ml aliquots arabinose. Arabinose induction was performed for 2 h at 0.2, 0.02, and 0.002% arabinose, after which the samples were spun down in a table-top centrifuge at  $\sim 20\,000g$  for 30 s. The media was aspirated and the pellets were frozen at  $-80^\circ\text{C}$ . The samples were run on a 12% SDS-PAGE gel for 1.5 h at 80 V in Tris/glycine/SDS buffer. The protein was transferred onto a polyvinylidene fluoride membrane for 1 h at 100 V at room temperature. The membrane was washed for 30 s in TBST, then blocked with 5% milk blocking buffer for 1 h. The primary antibody (Anti-express antibody, Invitrogen) was diluted 1:5000 and incubated with the membrane blot overnight at 4°C. The membrane was washed five times for 10 min with TBST, followed by a 1-h incubation with a 1:5000 dilution of the secondary antibody (goat anti-mouse IgG horseradish peroxidase). The membrane was washed five times for 5 min with TBST. Luminol reagent was used for chemiluminescence imaging (Santa Cruz Biotechnology, sc2048).

### tRNA enrichment

BW25113 and  $\Delta$ iscU were cultured overnight and diluted 1:100 to 20 ml in the morning. When the cultures reached  $\sim 0.5$  OD 600 nm, the samples were placed on ice. The cells were pelleted at 5000 r.p.m. for 5 min at 4°C and the supernatant was decanted. tRNA enrichment was performed using standard techniques. Briefly, the cell pellets were resuspended in 300  $\mu$ l cold sodium acetate (0.3 M, pH 4.5, 10 mM EDTA) and transferred to eppendorf tubes. The samples were snap frozen in liquid nitrogen. After thawing, 300  $\mu$ l phenol:chloroform (pH 4.7) was added to the samples and vortexed four times for 30 s bursts with 1 min incubation on ice in between. The samples were centrifuged for 15 min at 4°C in a table-top centrifuge at maximum speed. The top layer (aqueous phase) was transferred to a new tube and the acid phenol extraction procedure was repeated. After the aqueous phase was transferred to a new tube, the RNA was ethanol precipitated by adding three volumes of cold 100% ethanol and spinning at maximum speed for 25 min at 4°C. The RNA pellet was resuspended in 60  $\mu$ l cold sodium acetate (0.3 M, pH 4.5) and precipitated again by adding 400  $\mu$ l 100% ethanol and spinning at maximum speed for 25 min at 4°C. The supernatant was decanted and all traces of ethanol were removed. The RNA pellet was air dried on ice then resuspended in 100  $\mu$ l cold sodium acetate (10 mM, pH 4.5).

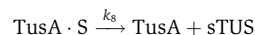
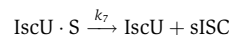
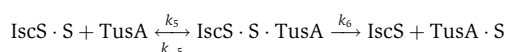
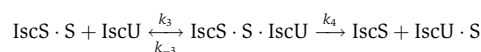
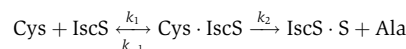
### APM northern blot

The APM northern blot was performed according to the protocol specified by Igloi (1988). Briefly, two 8 M Urea, 5% acrylamide gels were cast in  $0.5 \times$  TBE buffer. One gel contained 200  $\mu$ l of 1 mg/ml APM (kindly supplied by Gabor Igloi) for 10 ml of gel. The gels were prerun for 30 min at 180 V in  $0.5 \times$  TBE. Approximately 2.5  $\mu$ g of RNA (for each well) was then mixed with  $2 \times$  loading buffer and heated to 65°C for 3 min before being cooled on ice for 1 min. The gels were run for  $\sim 45$  min at 180 V. The RNA was transferred onto a nylon membrane using a semi-dry system for 1 h at 250 mA. The transfer buffer contained  $0.5 \times$  TBE supplemented with 10 mM  $\beta$ -mercaptoethanol. The RNA was then UV crosslinked to the nylon membrane. T4 Polynucleotide Kinase (PNK) was used to radiolabel 25 pmol of  $^{32}\text{P}$  ATP to 25 pmol of tRNA<sup>Lys</sup>(UUU) oligonucleotide probe for each blot. The oligonucleotide sequence used to probe tRNA<sup>Lys</sup>(UUU) was 5'-TGGGTCGTGCAGGATTTCGAA-3'. Qiagen's Qiaquick Nucleotide Exchange Kit was used to remove free  $^{32}\text{P}$  ATP. The blots were incubated in 25 ml of prehybridization buffer ( $10 \times$  Denhardt's,  $6 \times$  SSC, 0.1% SDS) at 42°C for 1 h. The labeled probe was heated to 95°C for 2–3 min before being added to the prehybridization buffer. The blots were hybridized at 42°C overnight. The next day, the blots were washed with high salt buffer ( $5 \times$  SSC, 0.1% SDS) at 37°C for 20 min twice, followed by two washes with low salt buffer ( $1 \times$  SSC, 0.1% SDS) at 42°C for 20 min. After the final wash, the blots were exposed to a phosphorscreen for 10 min.

### Mathematical modeling

We constructed a competitive inhibition model based on the following assumed mechanisms: (1) the cysteine desulfurase IscS binds sulfur, converting cysteine to alanine in the process; (2) thiolated IscS presents sulfur to the apo forms of TusA and IscU; (3) TusA and IscU bind thiolated IscS with their respective affinities and obtain the sulfur; (4) TusA and IscU transfer the sulfur to their downstream pathways, represented as sTUS and sISC, respectively. The source code for our model can be downloaded from <https://simtk.org/home/lambda-tus>.

The reactions are as follows:



From these reactions we derived the following set of ordinary differential equations and mass conservation relationships:

$$\frac{d[\text{Cys}]}{dt} = k_{-1}[\text{Cys} \cdot \text{IscS}] - k_1[\text{Cys}][\text{IscS}]$$

$$\frac{d[\text{Cys} \cdot \text{IscS}]}{dt} = k_1[\text{Cys}][\text{IscS}] - (k_{-1} + k_2)[\text{Cys} \cdot \text{IscS}]$$

$$\begin{aligned} \frac{d[\text{IscS} \cdot \text{S}]}{dt} = & k_2[\text{Cys} \cdot \text{IscS}] + k_{-3}[\text{IscS} \cdot \text{S} \cdot \text{IscU}] + k_{-5}[\text{IscS} \cdot \text{S} \cdot \text{TusA}] \\ & - k_3[\text{IscS} \cdot \text{S}][\text{IscU}] - k_5[\text{IscS} \cdot \text{S}][\text{TusA}] \end{aligned}$$

$$\frac{d[\text{IscU}]}{dt} = k_{-3}[\text{IscS} \cdot \text{S} \cdot \text{IscU}] + k_7[\text{IscU} \cdot \text{S}] - k_3[\text{IscS} \cdot \text{S}][\text{IscU}]$$

$$\frac{d[\text{IscS} \cdot \text{S} \cdot \text{IscU}]}{dt} = k_3[\text{IscS} \cdot \text{S}][\text{IscU}] - (k_{-3} + k_4)[\text{IscS} \cdot \text{S} \cdot \text{IscU}]$$

$$\frac{d[\text{TusA}]}{dt} = k_{-5}[\text{IscS} \cdot \text{S} \cdot \text{TusA}] + k_8[\text{TusA} \cdot \text{S}] - k_5[\text{IscS} \cdot \text{S}][\text{TusA}]$$

$$\frac{d[\text{IscS} \cdot \text{S} \cdot \text{TusA}]}{dt} = k_5[\text{IscS} \cdot \text{S}][\text{TusA}] - (k_{-5} + k_6)[\text{IscS} \cdot \text{S} \cdot \text{TusA}]$$

$$\frac{d[\text{sISC}]}{dt} = k_7[\text{IscU} \cdot \text{S}]$$

$$\frac{d[\text{sTUS}]}{dt} = k_8[\text{TusA} \cdot \text{S}]$$

$$[\text{IscS}] + [\text{Cys} \cdot \text{IscS}] + [\text{IscS} \cdot \text{S}] + [\text{IscS} \cdot \text{S} \cdot \text{IscU}] + [\text{IscS} \cdot \text{S} \cdot \text{TusA}] = [\text{IscS}]_{\text{TOTAL}}$$

$$[\text{IscU}] + [\text{IscU} \cdot \text{S}] + [\text{IscS} \cdot \text{S} \cdot \text{IscU}] = [\text{IscU}]_{\text{TOTAL}}$$

$$[\text{TusA}] + [\text{TusA} \cdot \text{S}] + [\text{IscS} \cdot \text{S} \cdot \text{TusA}] = [\text{TusA}]_{\text{TOTAL}}$$

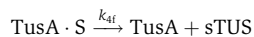
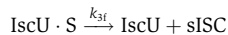
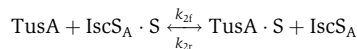
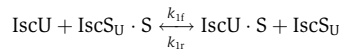
$$[\text{Cys}] + [\text{IscS} \cdot \text{Cys}] + [\text{Ala}] = [\text{Cys}]_{\text{TOTAL}}$$

Many of the parameter values were taken from the literature. Taniguchi *et al* (2010) reported values of  $\sim 800$  IscS proteins per cell and 450 IscU proteins per cell. Approximating the *E. coli* volume as  $10^{-15}$  L, we obtained concentrations of 1.37 and 0.77  $\mu\text{M}$  for IscS and IscU, respectively. Since TusA amounts were not reported, we estimated its concentration to be similar to but less than IscU 0.5  $\mu\text{M}$ . An *in-vitro* study reported the  $K_d$  values of IscS and IscU to be 2  $\mu\text{M}$ , and the  $k_{\text{cat}}$  ( $k_2$  in the above equations) to be 8.5 per minute (Urbina *et al*, 2001). IscU displaced TusA in a three-way pull-down assay (Shi *et al*, 2010), from which we hypothesized that the  $K_d$  of TusA-IscU was 20% more than that of IscU-IscS. The cysteine concentration was chosen to be equal to the IscS concentration.

The forward rates of reaction were assigned as follows:  $k_1=k_3=k_5=k_7=k_8=10^5$ ,  $k_4=k_6=k_{-3}$ . The reverse reaction rates were obtained by multiplying the corresponding forward rate by the appropriate dissociation constant. Gene deletion conditions were simulated by setting the pertinent concentration values to zero. IscU titrations were modeled by setting its concentration to 50, 100, and 150% of the WT amount.

Steady-state values of the sTUS parameter relative to WT were used to scale the amplification factor  $b$  in our previous non-dimensionalized predator-prey model (Maynard *et al*, 2010). We simulated infection dynamics with the following parameters:  $k_i=0.25$ ,  $f=0.93$ ,  $b=10 \cdot \frac{s\text{TUS}+s\text{TUS}_{\text{WT}}}{s\text{TUS}_{\text{WT}}}$ ,  $\mu^*=0.3$ ,  $K^*=0.4$ ,  $k_s=0$ .

The independent effect model hypothesizes that there is no competition between IscU and TusA for sulfur. Thus, they each receive their own (equally sized) pool of thiolated IscS ( $\text{iscS}_{\text{U}} \cdot \text{S}$  belongs to IscU and  $\text{iscS}_{\text{A}} \cdot \text{S}$  belongs to TusA). The dissociation constants of both IscU and TusA with their respective pools of IscS were set to 2.7  $\mu\text{M}$ . The concentrations of IscU and TusA were set to the same values as in the competitive model. The amount of thiolated IscS, however, was increased 100-fold to prevent it from being limiting. The reactions are as follows:



From these, we derived the following set of ordinary differential equations and constraints:

$$\frac{d[\text{IscU}]}{dt} = k_{1r}[\text{IscU} \cdot \text{S}][\text{IscS}_{\text{U}}] + k_{3f}[\text{IscU} \cdot \text{S}] - k_{1f}[\text{IscU}][\text{IscS}_{\text{U}} \cdot \text{S}]$$

$$\frac{d[\text{TusA}]}{dt} = k_{2r}[\text{TusA} \cdot \text{S}][\text{IscS}_{\text{A}}] + k_{4f}[\text{TusA} \cdot \text{S}] - k_{2f}[\text{TusA}][\text{IscS}_{\text{A}} \cdot \text{S}]$$

$$\frac{d[\text{IscS}_{\text{U}} \cdot \text{S}]}{dt} = k_{1r}[\text{IscU} \cdot \text{S}][\text{IscS}_{\text{U}}] - k_{1f}[\text{IscU}][\text{IscS}_{\text{U}} \cdot \text{S}]$$

$$\frac{d[\text{IscS}_{\text{A}} \cdot \text{S}]}{dt} = k_{2r}[\text{TusA} \cdot \text{S}][\text{IscS}_{\text{A}}] - k_{2f}[\text{TusA}][\text{IscS}_{\text{A}} \cdot \text{S}]$$

$$\frac{d[\text{sISC}]}{dt} = k_{3f}[\text{IscU} \cdot \text{S}]$$

$$\frac{d[\text{sTUS}]}{dt} = k_{4f}[\text{TusA} \cdot \text{S}]$$

$$[\text{IscU}] + [\text{IscU} \cdot \text{S}] = [\text{IscU}]_{\text{TOTAL}}$$

$$[\text{TusA}] + [\text{TusA} \cdot \text{S}] = [\text{TusA}]_{\text{TOTAL}}$$

$$[\text{IscS}_{\text{U}} \cdot \text{S}] + [\text{IscS}_{\text{U}}] = [\text{IscS}_{\text{U}} \cdot \text{S}]_{\text{TOTAL}}$$

$$[\text{IscS}_{\text{A}} \cdot \text{S}] + [\text{IscS}_{\text{A}}] = [\text{IscS}_{\text{A}} \cdot \text{S}]_{\text{TOTAL}}$$

$$[\text{IscS}_{\text{U}} \cdot \text{S}]_{\text{TOTAL}} = [\text{IscS}_{\text{A}} \cdot \text{S}]_{\text{TOTAL}}$$

The kinetic parameters were specified as follows:  $k_{1f}=k_{2f}=k_{3f}=k_{4f}=10^5$ . Non-zero reverse rates were set to the product of the forward rate and the appropriate dissociation constant.

Steady-state values of the sTUS and sISC parameters relative to WT were used to scale the amplification factor  $b$ . Parameters for the predator-prey equation were  $k_i=0.25$ ,  $f=0.93$ ,  $b=10 \cdot \frac{s\text{TUS}+s\text{TUS}_{\text{WT}}}{s\text{TUS}_{\text{WT}}} - 50 \cdot \frac{s\text{ISC}-s\text{ISC}_{\text{WT}}}{s\text{ISC}_{\text{WT}}}$ ,  $\mu^*=0.3$ ,  $K^*=0.4$ ,  $k_s=0$ . We see that in both models, the WT burst rate is 20 and the *tusA* knockout burst rate is 10. Supplementary Table 1 describes the parameters used in the two models.

The standard ode23s solver in Matlab was used for solving the sulfur transfer equations. The ode45 solver was used to solve the predator-prey equations.

## Supplementary information

Supplementary information is available at the *Molecular Systems Biology* website ([www.nature.com/msb](http://www.nature.com/msb)).

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*Author contributions:* NDM, KK, and MWC conceived and designed the experiments. NDM and DNM performed the experiments. NDM, DNM, and MWC analyzed the data. NDM and DNM contributed reagents/materials/analysis tools. NDM, DNM, KK, and MWC wrote the paper.

## Conflict of interest

The authors declare that they have no conflict of interest.

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