

Queuosine-modified tRNAs confer nutritional control of protein translation

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Abstract

Global protein translation as well as translation at the codon level can be regulated by tRNA modifications. In eukaryotes, levels of tRNA queuosinylation reflect the bioavailability of the precursor queuine, which is salvaged from the diet and gut microbiota. We show here that nutritionally determined Q-tRNA levels promote Dnmt2-mediated methylation of tRNA Asp and control translational speed of Q-decoded codons as well as at near-cognate codons. Deregulation of translation upon queuine depletion results in unfolded proteins that trigger endoplasmic reticulum stress and activation of the unfolded protein response, both in cultured human cell lines and in germ-free mice fed with a queuosinedeficient diet. Taken together, our findings comprehensively resolve the role of this anticodon tRNA modification in the context of native protein translation and describe a novel mechanism that links nutritionally determined modification levels to effective polypeptide synthesis and cellular homeostasis.

Keywords cytosine-5 methylation; protein translation; queuosine; tRNA modifications; unfolded protein response

Subject Categories Metabolism; Protein Biosynthesis & Quality Control; RNA Biology

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Introduction

The correct assignment of 20 amino acids to each of the 64 possible codon triplets within the messenger RNA (mRNA)-coding sequence determines accurate protein synthesis. Codon:anticodon recognition is mediated by transfer RNAs (tRNAs), which physically link mRNAs

to the amino acid sequence of the nascent polypeptide at the ribosome. The 1st and 2nd base of the codon and the 3rd and 2nd base of the anticodon, respectively, interact according to the Watson–Crick base-pairing rules (A:U, U:A, G:C, and C:G). In contrast, the interaction between the 3^{rd} base of the codon and the 1^{st} base of the anticodon (position 34, so-called wobble base) is less stringent, so that non-standard base pairings are permitted (Crick, 1966). As a result, a given tRNA may read more than one synonymous codon. Posttranscriptional modifications in the anticodon loop of tRNAs are critical for the translation process (Grosjean et al, 2010). In particular, position 34 is subject to various modifications (Agris et al, 2017), depending on the associated tRNA isoacceptor and the organism (Grosjean et al, 2010; El Yacoubi et al, 2012). Some of these modifications have been shown to be important for the fine-tuning of protein translation and for the maintenance of proteome integrity in yeast and in C. elegans (Rezgui et al, 2013; Zinshteyn & Gilbert, 2013; Nedialkova & Leidel, 2015; Chou et al, 2017).

Queuosine is a hyper-modified guanosine analog that comprises a 7-deaza-guanine core structure covalently linked to an amino-methyl side chain and a cyclo-pentanediol moiety (Fergus et al, 2015). The corresponding base is termed queuine (q), and the respective nucleotide is called queuosine (Q). Q occurs at the wobble position of tRNAs with GUN anticodons ${\rm tRNA^{Asp}}_{\rm GUC}, \ {\rm tRNA^{His}}_{\rm GUG}, \ {\rm tRNA^{Tyr}}_{\rm GUA}, \ {\rm and} \ {\rm tRNA^{Asn}}_{\rm GUU}$ (Harada & Nishimura, 1972). In eukaryotes, both NAC/U codons are translated by tRNA genes with GUN anticodons. The translation of NAU is mediated by a non-canonical G:U pairing. In eubacteria, lack of Q affects mRNA translation and reduces the virulence of certain pathogenic strains (Durand et al, 2000). In animal cells, changes in the abundance of Q have been shown to correlate with diverse phenomena including stress tolerance, cell proliferation, and tumor growth (Fergus et al, 2015). Nonetheless, the function of Q in mammals remains poorly understood. Animals obtain Q (or its analogs) as a micronutrient from dietary sources and from the gut microbiota (Farkas, 1980; Fergus et al, 2015). The difficulty of maintaining animals under bacteria-free

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conditions and/or on Q-deficient diets has severely hampered the study of Q metabolism and function in metazoans. Nevertheless, germ-free mice fed with a Q-free diet have been shown to be deficient in queuosine modifications of tRNA, while exogenous administration of queuine restores Q-tRNA (Reyniers *et al*, 1981).

Cytosine-5 methylation (m⁵C) is a widely known modification in the context of DNA methylation and epigenetic gene regulation (Jones, 2012). Interestingly, m⁵C also represents a conserved RNA modification (Gilbert et al, 2016), and several recent studies have provided evidence for a conserved role in the regulation of protein translation (Tuorto & Lyko, 2016). We have previously shown that Dnmt2-mediated tRNA methylation affects the speed and accuracy of protein translation (Tuorto et al, 2015). In higher eukarvotes, m⁵C-tRNA methylation is found at positions 48, 49, and 72, and in the anticodon loop at positions 34 and 38 (Motorin et al, 2010). The absence of a methyl group at these positions has been suggested to interfere with tRNA folding and stability, codon-anticodon interactions, and reading frame maintenance (Agris, 2004; Grosjean et al, 2010; El Yacoubi et al, 2012; Guy et al, 2014; Hori, 2014). Interestingly, tRNA^{Asp} is modified with both m⁵C and Q, and it has been shown recently that DNMT2-dependent tRNA methylation is enhanced by queuine in S. pombe and in D. discoideum (Muller et al, 2015).

Remarkably, the choice of C- versus U-ending codons of certain developmental genes in Drosophila and the codon usage across Drosophila species at evolutionarily conserved Q codon sites relates to the level of Q-tRNA modification (Zaborske et al, 2014). More specifically, it was observed that the level of Q-modification provides an accuracy-driven selective advantage of C- over U-ending codons. This suggested a "kinetic competition model", wherein the presence of Q34 leads to more accurate translation of the C-ending codon as a result of increased binding affinity (Zaborske et al, 2014). This indicated that environmental conditions, such as the availability of a micronutrient from the gut microbiota, can influence the decoding of a genome. However, this concept is currently only supported by codon usage analysis in Drosophila, and direct experimental evidence has been lacking. Furthermore, the described preference of Q-tRNAs for C- over U-ending codons is in contrast with earlier findings that either did not detect any Q-dependent changes in protein synthesis (Owenby et al, 1979) or suggested a mild preference for Q:U pairings over Q:C (Meier et al, 1985; Morris et al, 1999).

Here, we have obtained translatomes of Q-containing and Q-lacking human cells to comprehensively analyze the role of queuine in the native protein translation context and describe a novel mechanism that links nutritionally determined tRNA modification levels to the effective polypeptide synthesis and cellular homeostasis. Using ribosome profiling and SILAC, we show that nutritionally determined Q-tRNA levels promote C38 methylation and control translational speed at codons decoded by Q-tRNAs and their near-cognate codons. The loss of Q-modification results in pronounced changes in cellular and organismal phenotypes including the induction of the unfolded protein response. Our results establish a novel molecular link between microbial-derived micronutrients and the coordinated decoding of the mammalian transcriptome, thus identifying a central nutrient-controlled mechanism for the fine-tuning of protein translation.

Results

C38 methylation depends on Q in mammalian cell lines

Standard cell culture medium contains $1-2 \times 10^{-8}$ M q, which is provided through the fetal bovine serum (S) supplement and is sufficient for the quantitative modification of tRNAs (Katze *et al*, 1982; Fergus *et al*, 2015). Therefore, to obtain a q-free cell culture system, human HeLa cells were grown in synthetic serum-free medium (SF) (Rakovich *et al*, 2011), in the absence or presence of chemically synthesized q (Fig 1A). To quantify Q-tRNA modification levels directly from total RNA, we used polyacrylamide gels that are covalently linked with N-acryloyl-3-aminophenylboronic acid (APB; Igloi & Kossel, 1985; Zaborske *et al*, 2014). In APB gels, the additional ribose moiety of Q slows down Q-tRNA migration compared to GtRNA, thus producing two bands, corresponding to Q-tRNA^{His}_{QUG} and G-tRNA^{His}_{GUG} (Fig 1A). Using APB Northern analysis, we



Figure 1. m⁵C38-tRNA^{Asp}_{GUC} dependency by Q in human cell culture.

- A APB Northern blot using a tRNA^{His} probe. m⁵C38 levels of tRNA^{Asp}_{GUC} were measured by 454 bisulfite sequencing at the indicated time points. Both queuosinylation and methylation levels could be restored by the addition of queuine. The slower migration of tRNA^{His} is eliminated by oxidizing the ribose with periodate, producing a single faster migrating band (ox).
- B The addition of queuine to HCT116 cells cultured in serum-free medium resulted in an increase in both queuosinylation and m^5C38 levels.
- C The addition of 20 nM queuine to the SF medium is sufficient to restore tRNA^{His}_{QUG} in HeLa, whereas 200 nM of q is necessary for queuosinylation of tRNA^{His}_{GUG} in HCT116 cells.

Data information: S (standard medium), SF (serum-free medium), q (queuine), Q (queuosine), and G (guanine).

Source data are available online for this figure.

confirmed a continuous reduction in Q-tRNA in our SF cell culture at various time points over a 21-day culture period with a probe specific to tRNA^{His} (Fig 1A). A similar loss of Q-tRNA was observed using a probe detecting tRNA^{Asn} (Fig EV1A). No separate Q and G bands were detected with tRNA^{Asp} and tRNA^{Tyr} (Fig EV1A), which is likely due to a secondary mannosyl modification of Q-tRNA^{Asp} and galactosyl modification of Q-tRNA^{Tyr} (Kasai *et al*, 1976; Zaborske *et al*, 2014).

In further experiments, we used tRNA bisulfite sequencing (Schaefer *et al*, 2009) to determine whether Dnmt2-mediated tRNA methylation is affected by the presence of q in the medium, as shown previously for tRNA^{Asp}_{GUC} in fission yeast (Muller *et al*, 2015). A reduction in m⁵C38 tRNA^{Asp}_{GUC} from 96 to 57% was observed in SF medium (Fig 1A), while methylation levels of the non-queuosinylated Dnmt2 targets tRNA^{Gly}_{GCC} and tRNA^{Val}_{AAC} remained unaffected after culturing for 3 weeks in SF medium (Fig EV1A and B). To confirm that Q is necessary for physiological C38 methylation levels, we added synthetic q in rescue experiments. Indeed, C38 methylation of tRNA^{Asp}_{GUC} was completely restored (Figs 1A and EV1A and B). These findings demonstrate that Q enhances DNMT2 activity on tRNA^{Asp}_{GUC} in a mammalian cell line.

We also addressed the conservation of this mechanism in an additional cell culture model, and SF conditions strongly reduced the queuosinylation of tRNA^{His} in human colorectal carcinoma cells (HCT116; Fig 1B). When we analyzed tRNA^{His} queuosinylation at various concentrations of q, we observed that in HeLa cells quantitative queuosinylation was achieved at 20 nM (Fig 1C), which corresponds to the q levels of standard cell culture media (Katze *et al*, 1982; Fergus *et al*, 2015). Interestingly, HCT116 cells required higher q concentrations (200 nM) to quantitatively modify

G-tRNA^{His}. This indicates a role of cell-type-specific factors in queuine uptake and salvage (Fergus *et al*, 2015; Zallot *et al*, 2017). Taken together, our data thus suggest a conserved post-transcriptional control mechanism of Q-tRNA and m^5 C38-tRNA modifications.

Q accelerates translational speed at Q-decoded codons

In subsequent experiments, we aimed to determine how Q and the Q-dependent m⁵C38 modification influence protein translation. To this end, we compared HeLa cells that were cultured 45 days under SF conditions with cells that were first cultured under SF conditions for 30 days and then received 20 nM queuine for 15 days (SF+qR) to rescue any q-dependent defects (Fig 2A). Furthermore, a parallel control culture (45 days) was established using SF conditions supplemented with 20 nM queuine for the entire duration of the experiment (SF+q) (Fig 2A). HeLa cells grown in standard medium (S) and in standard medium supplemented with 20 nM queuine were included as additional controls (Fig 2A). Under all conditions, levels of Q-tRNA^{His} and m⁵C38-tRNA strictly depended on the availability of the supplemented q (Fig 2B). tRNA level measurements excluded an effect due to altered tRNA stability or tRNA availability by Q (Figs 2B and EV1C and D). We then examined genome-wide codon occupancy during translation elongation, in different culture conditions (Fig 2A) using ribosome profiling. In this method, ribosome-protected mRNA fragments are sequenced to obtain ribosomal position-specific information at single-nucleotide resolution (Ingolia et al, 2011). Two independent biological replicates for each culture condition were analyzed and showed a strong correlation (Fig EV2A). Quality controls (Figs 2C and D, and EV2A) suggested the generation of high-quality datasets. Data



Figure 2. Q-depleted and quantitatively modified cell culture conditions.

A Cell culture timing schedule.

B Corresponding queuosinylation and methylation levels, as determined by Northern blot using a tRNA^{His} probe and bisulfite sequencing of tRNA^{Asp}GUC

- C Representative metaplot of SF cells. 25–32 mer ribosome footprint reads were summed across all annotated reading frames with the AUG staring codon at position zero. In-frame 27–30 mer ribosome footprints showing the correct periodicity.
- D Representative metagene plot of 27–30 mer ribosome footprints in S and SF culture conditions for two biological replicates (rep1 and rep2).

Data information: S (standard medium), SF (serum-free medium), q (queuine), Q (queuosine), and G (guanine). Source data are available online for this figure.

analysis revealed that q-free culture conditions resulted in a significant (P < 0.05, *t*-test) increase in ribosome density at specific codons (Figs 3A and EV2B), which included all the queuosinedecoded codons: tRNA^{Asp}, tRNA^{Tyr}, tRNA^{His}, and tRNA^{Asn} (Figs 3A and EV2B), suggesting that translation of these codons was slower in the absence of the Q-modification. We also observed reduced translation speed at specific near-cognate Q-decoded codons such as Glu (GAA, GAG), in agreement with earlier results from m⁵C38deficient mice (Tuorto et al, 2015). Hierarchical clustering of codons according to translational speed also resulted in the consistent separation of Q-decoded and related near-cognate codons from all the other codons (Fig EV2C). Notably, focusing on synonymous codon pairs, the U-ending codons were slowed down more severely than the C-ending codons, except for tRNA^{Asp}_{GUC}, where the concomitant reduction in m⁵C38 resulted in a slower translation of the GAC codon (Fig 3B).

To confirm this finding, we used stable isotope labeling by amino acids (SILAC) in HeLa cell culture in the presence or absence of q for 3 weeks (Fig EV3A–C, Dataset EV1). Codon usage analysis of deregulated proteins confirmed an effect of Q on codons decoded by Q-tRNA and near-cognate codons (Fig 3C). Indeed, codons translated slower by Q-tRNA in the absence of the Q-modification were enriched in down-regulated proteins and depleted in up-regulated proteins in both forward and reverse labeling (Figs 3D and EV3D). These results confirm the ribosome profiling findings with an orthogonal approach and strongly indicate a role of Q and m⁵C38 in the decoding of the mammalian transcriptome.

Q-dependent phenotypes in cultured cell lines

To characterize the phenotypic consequences of Q depletion, we performed gene ontology (GO) enrichment analysis on mRNAs that were differentially translated in Q-depleted cells (Figs 4A and EV4A–C, and Dataset EV2). Ingenuity pathway analysis revealed a strong enrichment for genes involved in eIF2 signaling (Fig 4B) a critical point of stress-induced regulation of translation in eukaryotic cells (Bhat *et al*, 2015). Accordingly, we also identified several pathways related to stress signaling (Fig 4B). Other significantly enriched pathways, such as p70S6K signaling (Fig 4B), provided links between protein translation and a plethora of cellular functions (Holz *et al*, 2005).

Figure 3. Effects of Q depletion on translational speed.

- A Heatmap showing codon occupancy according to the color scale. Green bars indicate Q-decoded codons. The Asp-GAC codon translated by Q- and m⁵C38-tRNA^{Asp}_{GUC} is shown in yellow and Lys and Glu codons are in orange. Lack of Q reduces ribosome translation speed at all Q-dependent codons and at near-cognate decoded codons.
- B Translational speed of C-ending codons relative to U-ending codons. Error bars: \pm SE of the permutated ratios of C-ending codon occupancy relative to U for the indicated conditions; (n = 4).
- C Heatmap displaying an increase or decrease in codon frequencies (‰) in SILAC down-regulated proteins relative to the average frequency of that codon in unchanged proteins.
- D Codons translated by Q-tRNA are depleted in down-regulated proteins and increased in up-regulated proteins in both forward and reverse SILAC.

Data information: S (standard medium), SF (serum-free medium), q (queuine), Q (queuosine), and G (guanine).

The affected signaling pathways are strictly linked to the observed cellular phenotypes in the absence of Q: reduced global protein translation capacities (Fig 4C) and reduced cell proliferation rates (Fig 4D). Similarly, GO analysis of the differentially translated mRNAs showed enrichment for molecular functions that are closely related to the observed growth phenotype, such as cellular development, cell growth, and proliferation (Fig EV4D). Taken together,





Figure 4. Q-dependent phenotypes in cultured cell lines.

- A The volcano plot shows differentially translated transcripts against adjusted *P*-values for SF compared to SF + q. Red dots indicate *P*_{adj} < 0.1 in multiple tests.
- B Comparative analysis of differentially translated mRNAs of both experimental groups (SF compared to SF + q and SF compared to SF + qR) using ingenuity pathway analysis identified EIF2 signaling as the most significantly affected canonical pathway.
- C Representative polysome profiles of HeLa cells grown in S and SF medium in the absence or presence of q. As a measurement for the global translation rate, the fraction of polysomal ribosomes was quantified; *P < 0.05 (t-test); n = 5.
- D Proliferation analysis of HeLa cells grown under the indicated culture conditions. Population doubling levels of three biological replicates were calculated for each time point. Error bars: \pm SD; *n* = 3.

Data information: S (standard medium), SF (serum-free medium), q (queuine), and RO (ribosome occupancy).

these results indicated that q-dependent protein translation affects cell growth signaling and activated stress signaling.

To further characterize the effects of q depletion, we also used a destabilized variant of firefly luciferase (FlucR188Q) with fused enhanced GFP (EGFP; Gupta *et al*, 2011). The luminescence activity of Fluc mutation reflects imbalances in cellular protein homeostasis, and it requires chaperone surveillance to maintain soluble and enzy-matically active state (Gupta *et al*, 2011). The GFP-tagged Fluc variant could efficiently be used to measure the formation of protein aggregates in the absence of Q (Fig 5A and B). Furthermore, and consistent with a decreased folding capacity, the destabilized

luciferase had a decreased luminescence activity in the absence of Q (Fig 5C). Importantly, the presence of aggregates and the luminescence activity of Fluc in Q-depleted cells were consistently lower compared to Q-rescue in the absence of any stress stimulus (Fig 5), which is likely due to the altered translational speed in Q-free cells.

We also used transmission electron microscopy (TEM) to characterize the cellular morphology and ultrastructure of Q-deficient cells. Remarkably, TEM analysis revealed a strong dilatation of the endoplasmic reticulum (ER; Ghadially, 1998), with irregular vacuolization in Q-depleted cells (Figs 6A and EV4E), suggesting



Figure 5. Translational stress results in unfolded proteins.

 A Representative fluorescence confocal images of live HeLa cells expressing Fluc-EGFP and FlucR188Q-EGFP maintained in SF compared to SF + q. Scale bars, 10 µm.
B Fluorescence intensity of aggregates was quantified as a fraction of fluorescence of the entire cell. The number of cells showing at least one aggregate is indicated. Ten cells were imaged for Fluc-EGFP and 20 cells for FlucR188Q-EGFP from three independent transfections; *P < 0.05 (t-test).

C Specific luminescence activity of EGFP-tagged sensor proteins maintained in SF compared to SF + q. Luciferase activity was normalized to the luciferase protein content in the sample. Error bars: \pm SD; *P < 0.05 (t-test); n = 8.

Data information: S (standard medium), SF (serum-free medium), q (queuine), and AU (arbitrary units).

pronounced ER stress. This finding was confirmed by immunostaining for the ER stress marker KDEL, which represents the Lys-Asp-Glu-Leu (KDEL) ER retrieval sequence and suggested an accumulation of ER chaperones due to misfolded proteins (Yamamoto *et al*, 2001) specifically in Q-depleted cells (Figs 6B and EV4F). Of note, the observed increase in ER size has also been shown to be an integral part of the cellular program to overcome ER stress and is closely associated with activation of the unfolded protein response (UPR) (Schuck *et al*, 2009).

Activation of the UPR leads to the phosphorylation of the eukaryotic translation initiation factor 2 alpha (eIF2a; Ron & Walter, 2007). Indeed, we observed an increase in phosphorylated $eIF2\alpha$ in Q-depleted cells (Figs 6B and EV4F and G), which was in agreement with the observed enrichment of eIF2 signaling genes among the mRNA that is differentially translated upon Q depletion (Fig 4B). In addition, we also detected increased staining and expression for the ATF4 transcription factor and the HSP70 chaperone, two key components of the UPR, that are known to increase the protein folding capacity of the ER under stress conditions (Figs 6B and EV4F; Buchberger et al, 2010), as well as HSPA5 a major ER chaperone protein (Wang et al, 2009), which is up-regulated in the absence of Q (Fig EV3C). It should be noted that the observed UPR activation is compatible with the adaptation of the cells to Q-free conditions, as this is not an acute stress response. Importantly, expression of all markers could be restored to baseline levels by the addition of 20 nM q to the cell culture medium (Figs 6B and EV4F). Taken together, these findings strongly suggest that translation defects in Q-deficient cells lead to the accumulation of misfolded proteins, which in turn trigger ER stress and the UPR.

Q-dependent phenotypes in mice

To analyze the effects of Q depletion *in vivo*, we used a germ-free mouse model (axenic NMRI mice, Fig EV5A). Axenic mice fed with conventional sterilized food showed physiological levels of both Q-tRNA (48–58% of total tRNA^{His} in liver) and m⁵C38 (94% of tRNA^{Asp} in liver) (Figs 7A and EV5B–D). In order to deplete Q in live animals, axenic mice were fed with a q-free synthetic diet. After 60 days, various tissues were analyzed for tRNA^{His} queuosinylation and for m⁵C38-tRNA^{Asp}_{GUC} (Figs 7A and EV5B–D). The results showed that highly proliferative tissues, such as the liver and small intestine, had very low levels of Q-tRNA (21% and 19% of total tRNA^{His}), whereas brain, which represents a tissue with very low turnover rates, retained high levels of Q-tRNA (60% of total tRNA^{His}; Figs 7A and EV5B–D). This is likely due to the efficient salvage of Q in non-proliferating tissues.

Reduced levels of Q-tRNA in mice were consistently associated with lower levels of C38 methylation (Figs 7A and EV5B–D). Importantly, both effects were partially reversed by the addition of synthetic q to the diet for 8 days (21–23% of tRNA^{His} for liver and intestine, 60% of tRNA^{His} for brain) and more efficiently for 60 days (33% of total tRNA^{His} for liver) (Figs 7A and EV5B–D). Taken together, these results confirm the Q dependency of m⁵C38-tRNA^{Asp}_{GUC} *in vivo*.

Next, we asked whether protein translation was affected in Qdepleted mouse tissues. We therefore measured the protein translation rate in freshly dissected livers by polysome profiling. The results showed that low levels of Q-tRNA and m⁵C-tRNA were consistently associated with reduced levels of ribosomes engaged in translation (Fig 7A and B). Addition of q to the diet significantly (P < 0.05, *t*-test) reversed the translation rate (Fig 7B). Consistent with reduced rates of protein translation, Q-deficient mice had a substantially reduced body weight (Fig 7C). This phenotype could again be effectively reversed by the addition of 40 nM synthetic q to the diet (Fig 7C).

We also performed proteome-wide profiling of Q-depleted liver samples using dimethyl-labeling analysis. We identified 1,690 common proteins in two biological replicates (Dataset EV3). Ingenuity pathway analysis of differentially expressed proteins identified all the nuclear retinoid X family of receptors signaling (LXR, PPARs, FXR, and RXR). RXR receptors act as "master regulators" of a number of different nuclear receptor-based signal transduction pathways, with roles in development, cell growth and differentiation, metabolism, and cell death (Fig 7E; Szanto et al, 2004). Concordantly, GO term analysis of the deregulated proteins showed enrichment for molecular functions such as lipid, carbohydrate, nucleic acid metabolism, and protein synthesis (Fig 7E). In addition, signaling pathway analysis confirmed UPR, ER stress, and oxidative stress signaling as deregulated pathways (Fig 7E), according, three wellestablished effectors of the UPR: HSPA5/Bip, HSP90b1, and CALR were up-regulated in the absence of Q (Fig 7D).

Finally, we used immunohistochemistry to analyze ER stress markers in mouse tissues to determine whether the limited availability of q leads to activation of the UPR *in vivo*. Indeed, the depletion of Q induced a strong increase in the ER stress marker KDEL in mouse liver (Figs 7F and EV5E). Again, the expression of this ER stress marker was reversed to physiological levels by the addition of q in the diet (Figs 7F and EV5E). Together, these results confirm our cell-based observations *in vivo*.

Discussion

In spite of various described Q-dependent phenotypes in different organisms (Vinayak & Pathak, 2010; Fergus *et al*, 2015), a mechanistic understanding for the role of Q in protein translation and cellular homeostasis is still missing. Our results show that nutrition-dependent levels of tRNA modifications control protein translation on the translatome scale. We find that reduced Q-tRNA and m⁵C38-tRNA^{Asp}_{GUC} modifications affect translational speed at Q-decoded codons and near-cognate codons. Their cumulative effects deregulate protein translation by modifying the amino acid composition of the proteome, resulting in unfolded proteins and protein aggregates, altered cell growth signaling and ultimately induce the activation of the unfolded protein response in cell culture and *in vivo*.

We have previously shown that the loss of C38 tRNA methylation in Dnmt2 knockout mice affects the discrimination of near-cognate codons, resulting in highly specific amino acid exchanges (Tuorto *et al*, 2015). Our present study identifies queuosinylation as a key example for the concept of modification-dependent genome recoding (Tuorto & Lyko, 2016). Interestingly, our findings provide evidence that nutritional factors are involved in this regulatory mechanism.

At present, our understanding of how nutrients control protein expression in mammalian cells and *in vivo* is relatively limited, although emerging evidence suggests that multiple mechanisms



Figure 6. ER stress and UPR response upon Q depletion.

- A Transmission electron microscopy images showing the increase in cystic ER vacuole upon q depletion. Arrowheads indicate rough endoplasmic reticulum while expansions are indicated by asterisks. Scale bar 250 nm.
- B Representative images showing immunofluorescence of HeLa cells grown in S and SF medium in the absence or presence of q. Anti-KDEL (ER stress marker), antieIF2-pS51 (ER stress-induced inhibitor of translation), anti-ATF4 (transcription factor that activates ER stress-responsive genes), and anti-Hps70 (chaperone). Nuclei were stained with Hoechst. Scale bar 10 µm.

Data information: S (standard medium), SF (serum-free medium), and q (queuine).



Figure 7. Q-dependent phenotypes in mice.

- A APB Northern blot using a tRNA^{His} probe. m⁵C38 levels were determined by 454 bisulfite sequencing of RNA from the same liver tissue. Both queuosinylation and methylation levels could be restored by the addition of q to the feed. The results are shown for three biological replicates.
- B Representative polysome profiles showing a reduction in the protein translation rate in the liver of axenic mice fed with a q-free synthetic diet. Addition of q to the q-free diet significantly rescued the translation rate. n = 3. Asterisks indicate statistically significant (P < 0.05, t-test) differences.
- C Box plot showing the body weight of mice fed a q-free synthetic diet for 60 days, center lines show the medians; box limits indicate the 25^{th} and 75^{th} percentiles, whiskers extend 1.5 times the interquartile range; n = 3. Addition of q to the q-free diet significantly rescued body weights.
- D Dimethyl-labeling analysis of -q versus +q liver tissue. Top 10% of deregulated proteins are indicated in red and blue. UPR effectors: HSPA5/BiP, HSP90b1, and CALR are in orange.
- E Gene ontology analysis of deregulated proteins. Signaling pathways and biological functions are presented
- F Liver sections from indicated mice were stained with anti-KDEL antibody. Arrowheads indicate ER-stressed hepatocytes. Scale bar 25 μm.

Data information: con (n = 3) mice were fed with conventional sterilized food, -q (n = 3) mice were fed with a q-free synthetic diet for 60 days, and +q (n = 3) mice were fed with the same synthetic diet supplemented with 40 nM queuine for 60 days.

Source data are available online for this figure.

exist (Kilberg *et al*, 2012). Our findings uncover a direct link between micronutrient availability and protein translation based on the dynamics of tRNA modifications. Variations in translation speed are increasingly recognized as a mechanism that couples the decoding of genetic information to nascent polypeptide maturation, altered folding, membrane targeting, and modifying enzyme interactions (Yu *et al*, 2015; Rodnina & Wintermeyer, 2016). Our results show that Q-tRNA and m⁵C38-tRNA^{Asp}_{GUC} affect the protein translation speed at specific codons. In our Q-free cell culture system and mouse model, dysregulation of translation resulted in the accumulation of misfolded proteins and aggregates that trigger the activation of ER stress and the UPR. This mechanism is in agreement with the phenotypes recently described in mouse and yeast that lack certain modifications at the wobble position (Laguesse *et al*, 2015; Nedialkova & Leidel, 2015; Chou *et al*, 2017).

Anticodon loop tRNA modifications are known to play a key role in the codon:anticodon pairing and decoding process (Agris et al, 2017). Recently, an alternative view of the genetic code has been proposed that considers the decoding process as an interplay of interactions between mRNA, tRNA, and rRNA taking place during protein synthesis (Grosjean & Westhof, 2016; Komar, 2016). Accordingly, decoding is explained by G + C "strong" or A + U "weak" binding capability of codon-anticodon pairs, in the context of the ribosome shape (Grosjean & Westhof, 2016). In this model, tRNA modifications have been proposed to equilibrate the codon-anticodon strength by increasing the binding of weak codons and destabilizing the strong ones (Grosjean & Westhof, 2016). In agreement with this model, our ribosome profiling data show that Q alters the cellular translatome by accelerating the comparably weak Asn/Tyr and the intermediate His/Asp codons. In addition, Q increased the rate of U-ending cognate recognition, which is in agreement with an earlier study on single Drosophila tRNA^{His} (Meier et al, 1985). In contrast, G-tRNA $^{Asp}_{GUC}$ became simultaneously reduced of m^5C upon Q depletion and GAC speed thus became more affected than GAU

Reduced translation speed was also observed at Glu (GAA, GAG) and Lys (AAA, AAG) codons, which is most likely caused by nearcognate G-tRNAs misreading. We suggest that G-tRNAs slow down the elongation rate of near-cognate triplets, reducing the ability of the ribosome to discriminate incorrect aminoacyl-tRNAs. Thus, the observed translational delay and ribosome stalling can be explained by the error-correcting action of the ribosome. The effect of G-tRNA on near-cognate codons is in agreement with recent findings showing that tRNA modifications do not solely serve to restrict the decoding capacity of the tRNA to its cognate codon, but also for the suppression of near-cognate stop codons (Blanchet et al, 2018). Finally, bulky tRNA modifications have also been proposed to avoid non-synonymous misreading by blocking second-position errors (Manickam et al, 2014; Rozov et al, 2015). Consistently, we observed reduced translation speed on Gly (GGU), Arg (CGU), or Ser (AGU) codons in the absence of Q. Altogether, our findings define a role for Q in the decoding of the mammalian transcriptome by modulating of translation speed at Q codons and near-cognate Q codons.

The frequencies of alternative synonymous codons vary both among species and among genes from the same species. However, the mechanisms determining codon usage bias, as well as the biological significances of biased codon composition, are only beginning to be deciphered (Nabiyouni *et al*, 2013; Zaborske *et al*, 2014). Positive selection for optimal codons due to benefits in translational efficiency and fidelity is a major evolutionary driver, and tRNA modifications have been suggested to play a central role by regulating the speed of ribosomal translation (Novoa & Ribas de Pouplana, 2012). Among eukaryotes, yeasts and mammals display distinct codon usage bias. For the codons translated by Q-modified tRNAs, the human preferences are for C-ending codons, whereas in yeast, U-ending codons are preferred (Nakamura *et al*, 2000). It will be interesting to further explore the impact of physiological and pathological changes in queuine bioavailability on the plasticity of protein translation.

Materials and Methods

Cell culture

HeLa and HCT116 cell lines were obtained from ATCC and authenticated by Multiplex Human Cell Line Authentication Test (Multiplexion). HeLa cell line was grown in Dulbecco's modified Eagle's medium (DMEM), while HCT116 cell line was cultured in McCoy's 5A. The cultures were supplemented with 10% heat-inactivated FBS, 2 mM L-glutamine, and a commercial cocktail of antibiotics (Invitrogen).

For all Q conditions, UltraCULTURE serum-free medium (Lonza) was supplemented with 2 mM L-glutamine and 100 units/ml penicillin/streptomycin. In order to dissociate cells, StemPro Accutase (Gibco) was used instead of trypsin, since trypsin is of animal source and may contain significant amount of Q. Synthetic queuine, kindly provided by Hans-Dieter Gerber and Gerhard Klebe (Universität Marburg) (Gerber & Klebe, 2012), was used at 20 nM unless otherwise stated. Viable cells were counted using a CASY Cell Counter (Roche Diagnostics).

Immunofluorescence, immunohistochemistry, and Western blotting

Immunofluorescence was performed on 2% PFA-fixed cells blocked with 10% NGS, 0.1% Triton X-100 in PBS. Secondary antibodies (Alexa Fluor-conjugated, Invitrogen) were added at a dilution of 1:500 for 45 min at room temperature. Cells were finally stained with DAPI and mounted with Fluoromount-G (SouthernBiotech). Confocal images were acquired on a Leica TCS SP5 microscope. All the images were processed with Photoshop CS5 (Adobe) software. Automated quantification of average fluorescence intensity was performed using ImageJ.

Tissue slices of mouse liver were fixed in 4% formaldehyde in PBS for histological and immunohistological analyses. Paraffinembedded liver sections (4 μ m) were stained with hematoxylin and eosin or alternatively processed with anti-KDEL using a standard immunohistochemistry protocol. Control sections were made by the omission of the primary antibody. The pictures were taken with the Mirax Viewer imaging system (Carl Zeiss MicroImaging GmbH).

Western blotting was performed according to the standard protocols using 100 μg of total proteins. Protein expression of EIF2S1 was analyzed using ImageJ.

Antibodies such as anti-KDEL (Abcam ab176333), anti-EIF2S1 (Abcam ab32157), anti-ATF4 (Cell Signaling 11815), anti-HSP70 (Abcam ab5439), and anti-EIF2 (Enzo ADI-KAP-CP130) were used.

Electron microscopy

Cells were fixed with 2.5% (w/v) glutaraldehyde (Plano, Wetzlar)/ 0.05 M cacodylate buffer (Serva). A second fixation using 2.5% (w/v) glutaraldehyde/2% (w/v) osmium tetroxide (ChemPur) in 0.05 M cacodylate buffer was performed. Subsequently, cells were embedded in araldite (Serva). Ultrathin sections (70 nm) were cut using an ultramicrotome (UCT Leica) and then contrasted applying uranyl acetate (West Chester) and citric lead (Serva). The analysis was performed with a Zeiss EM 910 microscope (Carl Zeiss), and micrographs were taken with a CCD K2 camera (TRS). Automated quantification of vacuole size was performed using camera System CCD 2K (Tröndle) and program EM Images SP (Tröndle).

Aggregate and luciferase assays

Cells were seeded in 96-well plates or in Chambered Coverglass (Thermo Scientific Nunc Lab-Tek II) 24 h before transfection and grown at appropriate conditions. 70-80% confluent cells were transfected with Fluc-GFP or FlucR188Q-GFP plasmids obtained by Addgene (Gupta et al, 2011) using jetPRIME Transfection Reagent (PolyPlus) according to the manufacturer's instructions. After 24 h, cells were directly assessed for GFP aggregation or luciferase activity. To assess GFP aggregation, confocal images of live cells were acquired using Leica TCS SP5 microscope. All the images were processed with Photoshop CS5 (Adobe) software. Automated quantification of fluorescence intensity of aggregates was obtained as a fraction of fluorescence of the entire cell using ImageJ. For Fluc activity measurements, ~10,000 cells were seeded in 96-well plates, and luciferase assay was performed according to manufacturer's instructions (Promega). Luminescence activity was then recorded in a luminometer (FLUOStar Optima) with acquisition time of 10 s. To determine relative specific luciferase activities, luciferase luminescence values were normalized to the luciferase protein content in the sample. After the measurements, aliquots were withdrawn and analyzed by immunoblotting with anti-GFP antibody (Roche 118114460001).

RNA isolation

50–100 mg of each tissue or 10^5-10^7 cells were homogenized in 1 ml of TRIzol (Invitrogen), and RNA was extracted according to the procedural guidelines. The nucleic acid concentrations and purity for further analysis were analyzed on the NanoDrop ND-1000. RNA integrity was measured on a TapeStation (Agilent). Samples were stored at -80° C.

Northern blot—acryloyl aminophenylboronic acid (APB) gels

Acryloyl aminophenylboronic acid gels were prepared and run with a few modifications according to Igloi and Kossel (1985) and Zaborske *et al* (2014). 15 μ g of RNA was deacetylated in 100 mM Tris–HCl pH 9 for 30 min at 37°C. RNA was ethanol-precipitated and resuspended in 1× RNA-loading dye (Fermentas). Periodate-oxidated samples were prepared as a control. Samples were then denatured for 10 min at 70°C and run at 4°C on TAE, 8 M urea, 15% acrylamide, and 5 mg/ml aminophenylboronic acid (Sigma) gels. Gels were blotted, hybridized, and quantified as described previously (Tuorto *et al*, 2012). Northern probes are listed in Appendix Table S1.

RNA bisulfite sequencing

Bisulfite conversion was performed using the EZ RNA MethylationTM Kit—Zymo. Amplicons for 454 (Roche) sequencing were generated by PCR as described in Tuorto *et al* (2015). The primer sequences are listed in Appendix Table S1. For each amplicon, sequences showing a conversion > 95% and a lower threshold identity > 90% were aligned and aggregated in heatmaps. The methylation rate was calculated at each position as the fraction of non-converted cytosines.

Polysome analysis

 10^7 cells were treated with cycloheximide (100 µg/ml) for 5 minutes washed once in cold PBS/cycloheximide (100 µg/ml) and lysed in 400 µl buffer (20 mM Tris–HCl, pH 7.4, 5 mM MgCl₂, 150 mM NaCl, 1% Triton X-100, 100 µg/ml cycloheximide, 1× complete protease inhibitors (Roche)). The lysates were centrifuged at 9,300 g for 10 min at 4°C, and the supernatants were applied to linear 17.5–50% sucrose gradients in 20 mM Tris–HCl (pH 7.4), 5 mM MgCl₂, and 150 mM NaCl. Centrifugation was carried out at 35,000 rpm for 2.5 h at 4°C in a Beckmann SW60 rotor. Gradients were eluted with an ISCO UA-6 gradient fractionator, and polysome profiles were recorded by continuously monitoring the absorbance at 254 nm. In order to calculate the fraction of ribosomes engaged in translation, the area under the polysomal part of the curve was divided by the area below the entire curve.

Ribosome footprinting

Ribosome footprinting was performed according to Ingolia *et al* (2011) and as previously described in Tuorto *et al* (2015). Briefly, 400 µl aliquot of lysate prepared as described above was treated with 4 U of DNase I (Thermo Scientific) and 800 U of RNase I (Ambion) for 45 min at room temperature with gentle shaking. 800 U of RNasin ribonuclease inhibitor (Promega) was added to quench the reaction, and the samples were run on a 17.5–50% sucrose gradient to isolate monosomes. Monosome-protected RNA fragments were end-repaired with T4 polynucleotide kinase (Takara) and size-selected at 28–31 nucleotides on a 15% polyacry-lamide TBE-urea gel. Sequencing libraries were prepared according to protocol of the NEB NEXT Small RNA Library Prep Set for Illumina (Multiplex Compatible) E7330.

RNA sequencing

RNA Sequencing libraries were prepared using the TruSeq RNA Sample Preparation Kit v2 (Illumina) according to manufacturer's instructions. Briefly, poly (A)+ RNA was purified from 1 µg of total RNA using oligo(dT) beads, fragmented, and converted to cDNA. The double-stranded cDNA fragments were then end-repaired, adenylated on the 3' end, adapter-ligated and amplified with 12 cycles of PCR. The final libraries were validated using Qubit Fluorometer (Life Technologies—Invitrogen) and Agilent TapeStation 4200 (Agilent Technologies). After size validation, libraries were normalized, pooled, and clustered on the cBot (Illumina, Inc.) with a final concentration of 10 pM (spiked with 1% PhiX control v3, Cat No. FC-110-3001) using the TruSeq SR Cluster Kit v3 (Cat no. GD-401-3001). Sequencing on HiSeq 2000 (Illumina) was performed using the 50 cycles TruSeq SBS Kit v3 according to the manufacturer's instructions.

Ribosome footprints and RNA-seq analysis

Ribosome footprint analysis was performed with minor changes as previously described (Tuorto et al, 2015). Briefly, sequenced reads from ribosome footprints were trimmed and adaptor sequences were removed. Resulting reads were kept if their size was in 25–35 nt, and further aligned to a depletion reference in a first step, with Bowtie (Ingolia et al, 2012), permitting two mismatches with base quality at least 70, using a seed of length of 23 nt. A reference database for read depletion was established from an exhaustive collection of human tRNA (CCA-appended sequences from gtrnadb.ucsc.edu), rRNA (arb-silva, Ensembl ncRNA, NCBI RefSeq, and Biobases), and mitochondrial tRNA and rRNA sequences (Ensembl ncRNA). Remaining reads after depletion were aligned to reference mRNA sequences from RefSeq. Annotation of codon sequence start and end position of this collection of mRNA transcripts was retrieved simultaneously. Total reads for each replicate were between 10.3 and 16.4 million reads, of which 1.4-2.6 million reads mapped to mRNA transcripts. Data analysis was performed using a local Galaxy server and custom Python and R scripts.

Resulting aligned reads containing the annotated codon start site were length-stratified (25-32 nt), and we counted each read start occurring at 20 nt upstream or downstream of the codon start. Lengths which exhibited three nucleotides periodicity were considered compatible with the subsequent A-site assignment rationale. A-site position was assigned according to an offset equal to +15 nt for 26-30 read lengths offset from the 5' end of the reads (Ingolia, 2010). Reads were assigned to a codon when mapped to -1, 0, +1relative to the first nucleotide of the codon (Tuorto et al, 2015). Occupancy of A-site codons was normalized by the frequency of the same codon in the non-decoded +1, +2, +3 triplets relative to the A-site, the first 15 codons of each ORF were excluded from this analysis (Lecanda et al, 2016). In addition, read counts per mRNA, RPKM, and standardized metagene density of footprints were determined. For the two latter, reads of at least 25 nt in length were considered.

Sequenced reads from RNA-seq were filtered and aligned similarly to ribosome footprints except that no superior limit on read length was set. Ribosome occupancy (RO) for differentially translated transcripts were determined as the ratio of number of footprints to number of transcripts from RNA-seq corresponding to a specific mRNA.

SILAC analysis

HeLa cells were first depleted of Q by growing 3 weeks in DMEM supplemented with 10% dialyzed FBS (Sigma), 2 mM $\ L$ -glutamine,

and a commercial cocktail of antibiotics (Invitrogen). Then, the cells were shifted to DMEM SILAC-labeling medium (Sigma D9443) supplemented with 10% dialyzed FBS, 0.105 g/l L-leucine, 0.084 g/l L-arginine monohydrochloride, and 0.584 g/l L-glutamine. 20 nM q, 0.152 g/l ¹³C₆,¹⁵N₂-L-lysine-hydrochloride, and 0.146 g/l L-lysine monohydrochloride were added to the cultures according to Fig EV3A. The cells were passed five times resulting in a population doubling higher than 12. Cell pellets were collected after three washes with PBS and snap-frozen in liquid N2. The proteome was extracted according to Sapcariu et al (2014). Briefly, cell pellets were resuspended in 400 µl of methanol, followed by the addition of 400 µl of water and 400 μl of chloroform. After centrifugation, the formed interface was precipitated and washed once with methanol. The dried pellet was resuspended in 8 M urea and 50 mM ammonium bicarbonate (pH 8.0). After reduction with 5 mM DTT and alkylation with 15 mM iodoacetamide, the proteins were digested in a two-step digestion with endopeptidase Lys-C, first digestion in 8 M urea at 37°C (0.4 µg Lys-C, Wako) followed by dilution to 2 M and digestion overnight (0.4 µg Lys-C, Wako, 37°C). The resulting peptides were cleaned up on a Sep-Pak C18 96 well plate (25 mg, Waters). The peptides were measured on a Q-Exactive Plus mass spectrometer (Thermo Scientific) coupled to an Ultimate 3000 RSLCnano system (Thermo Scientific) in data-dependent acquisition mode, selecting the top 12 peaks for higher energy collisional dissociation (HCD) fragmentation. A 90-min gradient (solvent A: 0.1% formic acid; solvent B: HPLC grade acetonitrile in 0.1% formic acid) was applied using an Acclaim PepMap trap column (2 cm \times 75 μm i.d., C18, 3 µm, 100 Å, Thermo Scientific) and an Acclaim PepMap RSLC analytical column (50 cm \times 75 μ m i.d., C18, 2 μ m, 100 Å, Thermo Scientific). A volume of 3 µl sample was injected and the peptides eluted with 90 min gradients of 2-35% solvent B at flowrates of 0.3 µl/min. MS1 data acquisition was performed at a resolution of 60,000, using an injection time of 45 ms in the scan range from 375 to 1,500 m/z and MS2 at a resolution of 15,000 with an injection time of 45 ms. The normalized collision energy was set to 28 eV. The mass window for precursor ion selection was set to 1.2 m/z. The recorded spectra were analyzed using the MaxQuant software package (Version 1.6.1.0), and data analysis was done with the R-software package (Version 3.4.4).

Proteins which are synthesized in -q and +q with the same rate have a log2 ratio of 0 (log2(1) = 0). The top 10% differentially expressed proteins were considered as regulated. Codon numbers for all mRNA transcripts were calculated, using the hg19 CCDS archive from NCBI. The numbers are represented as per thousand of the whole coding sequence. The codon frequencies for the regulated proteins were calculated and compared to the codon frequency of identified unchanged proteins to avoid a bias from the identification preference.

Mice and ethics statement

All mouse husbandry and experiments were carried out at the German Cancer Research Center pathogen-free animal facility according to applicable laws and regulations. The axenic NMRI mice were held in isolators in a sterile environment. NMRI control mice were fed an autoclaved diet (3307 PML15 Provimi Kliba SA, CH). The queuine-free diet was based on a previously published chemically defined diet (Marks & Farkas, 1997). All the components were

added to the diet in powder form (Altromin, Germany Cat# C 1069), and fresh powder was dissolved in an appropriate amount of sterile water on a daily basis. Tyr-ethyl ester was replaced with L-tyrosine.

The addition of q to the feed was done by sterile filtration and UV irradiation of a 100 μ M stock of queuine-hydrochloride in sterile water. The stock was stored at -20° C, and a final concentration of 40 ng/ml was fed the mice.

Dimethyl-labeling analysis

Protein samples were run on SDS-PAGE and fractionated. Gel pieces were cut out, cysteines were reduced by adding DTT, and then carbamidomethylated using iodoacetamide followed by overnight digestion with trypsin. For quantification, peptides were chemically labeled by stable isotope dimethyl labeling and pooled before LC-MS analysis according to -q light, +q medium, for two biological replicates per condition. Resulting peptides were loaded on a cartridge trap column, packed with Acclaim PepMap300 C18, 5 µm, 300 Å wide pore (Thermo Scientific), and separated in a 180-min gradient from 3% to 40% ACN on a nanoEase MZ Peptide analytical column (300 Å, 1.7 μ m, 75 μ m × 200 mm, Waters). Eluting peptides were analyzed using an online-coupled Q-Exactive-HF-X mass spectrometer. Data analysis was carried out by MaxQuant (version 1.6.0.16). In total, 24,033 peptides and 2,399 proteins were identified by MSMS based on an FDR cutoff of 0.01 on peptide level and 0.01 on protein level. Quantification was done using a DML duplex approach and DimethLys4;DimethNter4 as isotopically labeled modifications. In total, 2,199 proteins were quantified.

Statistical analysis

Differential expression and RO were assessed using DESeq2 (Anders & Huber, 2010) and RiboDiff (Zhong *et al*, 2017), respectively. Differences in codon occupancy from unity were determined using an unpaired two-tailed *t*-test. To determine if codon occupancy distribution was significantly different in a condition as compared to a control, it was compared to a basal distribution (calculated by dividing codon occupancy in one replicate by the other replicate) using a Kolmogorov–Smirnov test in R. Error bars represent standard error if not otherwise stated. Heatmap and hierarchical clustering were obtained using ClustVis (http://biit.cs.ut.ee/c lustvis/). The significance of quantitative data was tested using unpaired, two-tailed Student's *t*-tests, unless otherwise stated.

Data accessibility

Gene expression and ribosome profiling sequencing data are available from the NCBI GEO database: GSE102315.

Expanded View for this article is available online.

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Author contributions

FT, AEE-M, and FL conceived the study, designed the experiments, and interpreted the results. FT, RL, and CC performed cell cultures and molecular analysis. FT performed ribosome profiling. CL performed statistical and computational analyses. GD performed SILAC measurements. GF and H-JG performed the mouse analysis and the TEM; MM provided key reagents. FT and FL wrote the manuscript with contributions from the other co-authors.

Conflict of interest

The authors declare that they have no conflict of interest.

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