



Quantifying the dynamics of IRES and cap translation with single-molecule resolution in live cells

Amanda Koch¹, Luis Aguilera², Tatsuya Morisaki¹ , Brian Munsky² and Timothy J. Stasevich^{1,3}

Viruses use internal ribosome entry sites (IRES) to hijack host ribosomes and promote cap-independent translation. Although they are well-studied in bulk, the dynamics of IRES-mediated translation remain unexplored at the single-molecule level. Here, we developed a bicistronic biosensor encoding distinct repeat epitopes in two open reading frames (ORFs), one translated from the 5' cap, and the other from the encephalomyocarditis virus IRES. When combined with a pair of complementary probes that bind the epitopes cotranslationally, the biosensor lights up in different colors depending on which ORF is translated. Using the sensor together with single-molecule tracking and computational modeling, we measured the kinetics of cap-dependent versus IRES-mediated translation in living human cells. We show that bursts of IRES translation are shorter and rarer than bursts of cap translation, although the situation reverses upon stress. Collectively, our data support a model for translational regulation primarily driven by transitions between translationally active and inactive RNA states.

While most eukaryotic messenger RNAs are translated in the canonical cap-dependent manner¹, some eukaryotic messages and many viral RNAs use an IRES to recruit ribosomes and initiate translation in a cap-independent manner. For example, important eukaryotic genes, such as vascular endothelial growth factor (*VEGF*), tumor protein P53 (*P53*), *MYC* and the *HOX* locus, all encode IRES elements to recruit ribosomes in conditions where canonical cap-dependent translation is repressed^{2–5}. Similarly, viruses have evolved IRES sequences to hijack host ribosomes during infection^{6,7}. Viral IRES sequences can be categorized into several distinct classes, each containing unique structural RNA motifs that attract different subsets of host translation factors^{8,9}, although most viral IRES sequences require fewer factors than the cap to support translation^{7,8,10–12}. Viruses exploit this during infection by triggering cellular stress to globally repress cap-dependent translation and free up host ribosomes. The end result is a large pool of host initiation factors and ribosomal subunits that are free to bind and initiate at viral IRES sequences at the peril of the host cell^{13–21}.

Most previous experimental analyses of IRES-mediated translation use bicistronic transcripts encoding an IRES between two reporter proteins^{22,23}, and quantify IRES activity by the ratio of upstream and downstream reporter expression^{9,24,25}. Although bicistronic reporters contain IRES sequences out of context, their inherent one-to-one cap:IRES stoichiometry ensures that both cap and IRES experience nearly identical subcellular environments, making it possible to fairly compare cap-dependent and IRES-mediated translation. Another advantage is they allow a precise dissection of the IRES element itself, independent of other compounding factors.

So far, bicistronic reporters have been beneficial for deducing the relative IRES activity in cells hours or days after transfection²⁶. However, these studies have lacked the spatiotemporal resolution needed to visualize the sites of IRES translation and quantify translation initiation and elongation kinetics in real-time. This has made it difficult to assess the heterogeneity of IRES-mediated translation

among individual RNA or within specific subcellular environments. Methods to study IRES-mediated translation with higher spatiotemporal resolution are needed to precisely understand how IRES-mediated translation differs from cap-dependent translation.

Here, we develop a real-time biosensor to quantify IRES-mediated translation dynamics with single-molecule resolution in living cells. We engineered complementary repeat epitopes into a bicistronic reporter, such that cap versus IRES translation could be monitored in two colors simultaneously from a single RNA using nascent-chain tracking (NCT)²⁷. The resulting biosensor captures the dynamics of cap versus IRES translation with resolutions of tens-of-nanometers in space and sub-seconds in time. Application to the IRES from the encephalomyocarditis virus (EMCV) uncovers the spatial organization and dynamics of single IRES-mediated translation sites compared to those driven by the cap under normal and stressful conditions in living U2OS cells. Given the ubiquity of non-canonical translation initiation, we anticipate our biosensor will find broad application in understanding the mechanisms of viral and eukaryotic IRES-mediated translation in diverse cellular conditions.

Results

A multicolor biosensor to compare cap and IRES translation at the single-molecule level in living cells. To fairly compare IRES and cap translation, we constructed a bicistronic NCT biosensor that is bound by different probes depending on the manner of translation initiation (Fig. 1a,b). Encoded under cap-dependent translation is a lysine demethylase 5B (KDM5B), amino-terminally fused to a spaghetti monster tag (SM) encoding 10×FLAG epitopes. The FLAG SM tag is bound by fluorescently conjugated fragment antigen-binding region (Fab) of anti-FLAG antibodies, allowing visualization of cap translation soon after the first FLAG epitope emerges from the ribosome^{27,28}. Encoded under IRES-mediated translation is a Kinesin-like protein (KIF18B), N-terminally tagged

¹Department of Biochemistry and Molecular Biology, Colorado State University, Fort Collins, CO, USA. ²Keck Scholars, Department of Chemical and Biological Engineering and School of Biomedical Engineering, Colorado State University, Fort Collins, CO, USA. ³World Research Hub Initiative, Institute of Innovative Research, Tokyo Institute of Technology, Yokohama, Japan. ✉e-mail: Brian.Munsky@colostate.edu; Tim.Stasevich@colostate.edu

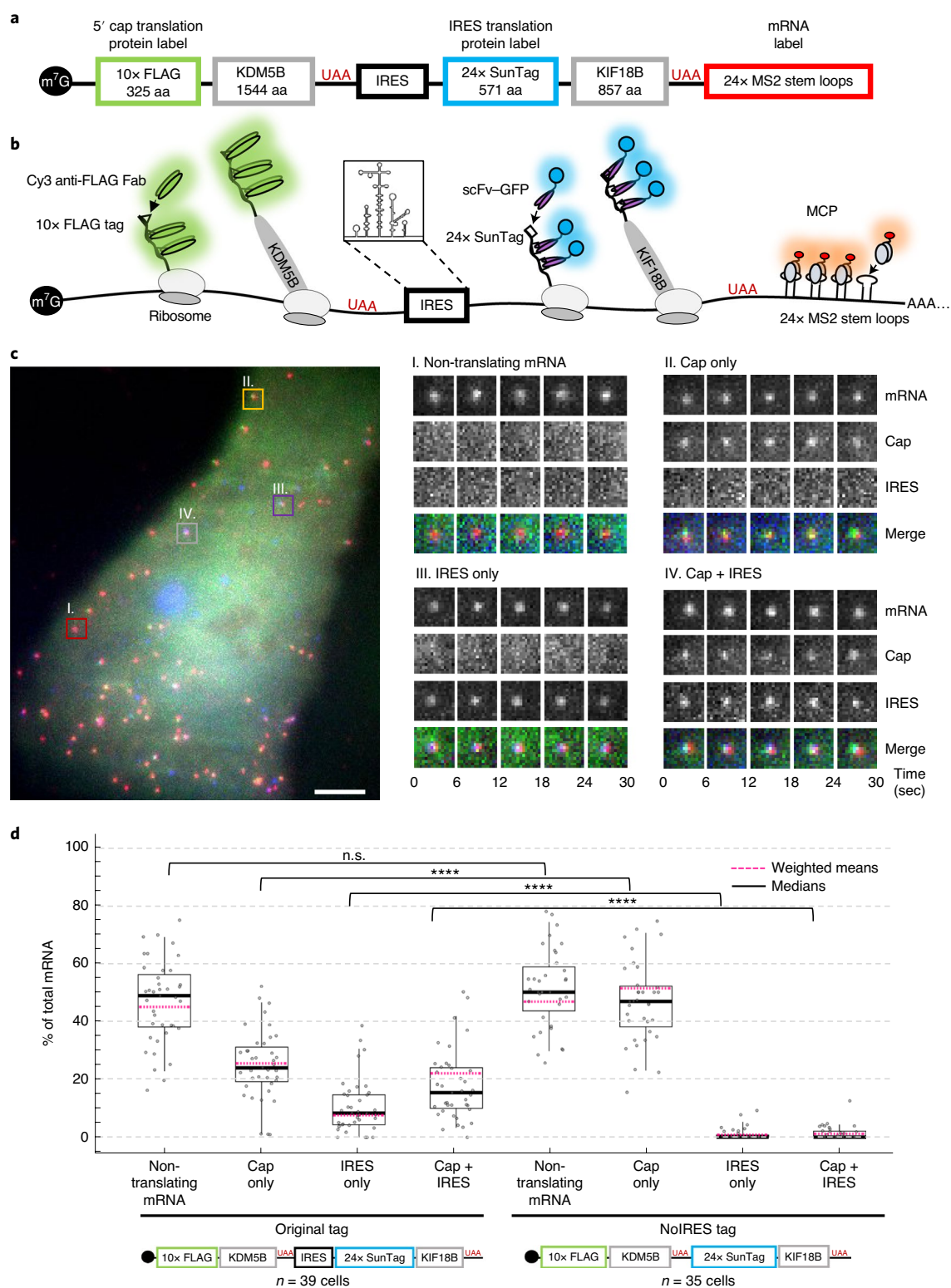


Fig. 1 | A multicolor biosensor to compare cap and IRES translation at the single-molecule level in living cells. a, Overview of the construct. m⁷G, 7-methylguanylate mRNA cap. **b**, Schematic of the system. Cap-dependent protein reporter (green) is labeled by anti-FLAG Fab conjugated to Cy3 that binds the 10x FLAG peptide epitopes in the N terminus. IRES-mediated protein reporter (blue) is labeled by a GCN4 scFv fused to a GFP that binds the 24x SunTag peptide epitopes. RNA (red) is marked by MCP-Halo labeled with JF646 that binds to repeated MS2 stem loops in the 3' UTR. **c**, Left, representative cell imaged 6 h after plasmid and probe loading. Different colored boxes within the cell illustrate different types of translation spots seen within a single cell. Right, examples of co-moving spots. i, Non-translating mRNA (red). ii, Single mRNA translating cap only (yellow). iii, Single mRNA translating IRES only (purple). iv, Single mRNA translating cap and IRES (gray). **d**, Quantification of species percentages out of total mRNA for both the original tag and the noIRES control. Each point represents the percentage of that species in a cell. The *P* values are based on a two-tailed Mann-Whitney test: *****P* < 0.0001. The thick black line indicates the median, the dashed red line represent the weighted (by mRNA per cell) mean, the box indicates the 25–75% range and the whiskers indicate the 5–95% range. n.s., non-significant.

with 24×SunTag epitopes²⁹ that are quickly bound by single-chain variable fragments (scFv) fused to green fluorescent protein (GFP) as the SunTag epitope emerges from the ribosome^{27,29}. In addition, the biosensor contains 24×MS2 stem loops in the 3′ untranslated region (UTR) that are bound by Halo-tagged MS2 coat proteins (MCP) (Fig. 1a,b)²⁸.

As a first application, we inserted the IRES element from EMCV into our biosensor. EMCV is a small single-stranded RNA virus that causes many mammalian diseases and is widely used in research settings to coexpress distinct gene products from a single transcript^{30–32}. The EMCV IRES sequence is 553 nucleotides in length and contains a methionine start codon for the preferred open reading frame (ORF) (Fig. 1b)^{31,32}. Previous assays have shown that the EMCV IRES recruits ribosomes without the need of a 5′ cap or many canonical translation initiation factors^{31,32}. However, little is known about when, where and how EMCV IRES-mediated translation occurs in living cells at the single-molecule level.

To visualize these aspects of EMCV IRES translation, we bead-loaded³³ DNA encoding our biosensor, along with purified anti-FLAG Cy3-Fab, anti-SunTag GFP-scFv and HaloTag-MCP into U2OS cells 3–6 h before imaging. With this combination of probes, translation sites exhibit protein labeled by Fab or scFv co-moving with mRNA labeled by MCP. In addition to non-translating mRNA (Fig. 1c(I)), we identified translation sites labeled by just Fab (Fig. 1c(II)), just scFv (Fig. 1c(III)) and both Fab and scFv (Fig. 1c(IV)), indicating cap-only translation, IRES-only translation and cap + IRES translation, respectively (Supplementary Video 1).

We performed two control studies to confirm that spots were active translation sites. First, to rule out fluorescence bleed-through from the protein channels to the mRNA channel, we repeated experiments without labeling mRNA. Regardless of the intensity of the translation signal, no bleed-through was observed in the mRNA channel (Extended Data Fig. 1a,b). All other bleed-through possibilities were ruled out by direct observations of distinct populations of non-translating mRNA, IRES-only translation sites and cap-only translation sites. Second, to show that the translation sites were active, we treated cells with 50 μg ml^{−1} puromycin, an elongation inhibitor that releases nascent chains from ribosomes³⁴, and we confirmed a rapid disappearance of all Fab or scFv translation signals within translation sites (Extended Data Fig. 1c).

To better quantify the heterogeneity of translation, we took 2.5-min movies (25 frames × 13 z planes per volume × 3 colors = 975 images per movie) of 39 cells from 8 experiments. Movies were acquired using HILO illumination to maximize signal-to-noise³⁵. In total, we observed 3,748 mRNAs, of which 1,784 were being translated. Of the mRNAs, 24% were translated in a cap-only manner, 8% in an IRES-only manner and 15% in a cap and IRES manner simultaneously (cap + IRES) (Fig. 1d, left). As a control, we removed the IRES element from our biosensor, and we observed almost complete reduction in anti-SunTag GFP-scFv signals (Fig. 1d, right), ruling out ribosomal crossover from cap to IRES. All else being equal, these data demonstrate that the IRES element alone can capture and initiate host ribosomes, but not as efficiently as the cap in a bicistronic context. Given the large fraction of transcripts that we observed being translated in both a cap- and IRES manner, these data also demonstrate that a single bicistronic transcript can be translated simultaneously in two open reading frames.

The EMCV IRES can be translated throughout the entire cell cytoplasm. We wondered why there were fewer EMCV IRES translation spots than cap spots. One possibility is that the IRES sequence itself requires a specific environment. For example, EMCV IRES-mediated translation is known to occur around replication complexes that localize to specific regions of cells³⁰. While this compartmentalization is likely mediated by many factors, the IRES sequence itself could play an active role in the process, or require

proper localization for translation. To test this, we quantified the propensity for IRES-mediated translation sites to compartmentalize in four ways. We first measured (1) the tendency of IRES-mediated translation sites to cluster and (2) their average distance to the nuclear periphery. This revealed the EMCV IRES has no preference for clustering (Extended Data Fig. 2a) and only a minor preference for translation in the perinuclear region (Extended Data Fig. 2b). We next tracked individual translation sites (Supplementary Video 2) to quantify (3) their mobilities and (4) their degrees of confinement. From the 3,771 mRNAs that we tracked, we calculated their cumulative distributions of diffusion coefficients and average mean squared displacements (Extended Data Fig. 2c,d). In both analyses, IRES-only translation sites were statistically indistinguishable from cap-only translation sites. Likewise, the confinement of IRES-only translation sites and that of cap-only translation sites, as quantified by a preference for 180° jumps over 0° jumps³⁶, were also indistinguishable (Extended Data Fig. 2e,f). According to all four metrics, IRES-mediated translation sites localize and move within cells similarly to cap-dependent translation sites. Collectively, these data suggest that the EMCV IRES does not require a specialized environment for translation.

IRES and cap translation sites have a similar size and ribosomal organization. Since we could not distinguish IRES-mediated translation sites on the basis of their subcellular localization or mobility, we wondered whether there were other features that could explain the lower probability of observing IRES-mediated translation sites. In particular, we wondered whether there were differences in the size of single IRES translation sites compared with that of single cap translation sites. Recently, the Zenklusen³⁷ and Parker³⁸ laboratories used smFISH to show that cap-translating ribosomes tend to stretch out translation sites—that is, heavily translated mRNA cover a greater volume within the cell, in contrast to models of mRNA looping³⁹. Because IRES-mediated translation sites do not require looping factors, they could have a different ribosomal organization than cap translation sites³⁰. To test this, we took advantage of the long ORFs in our biosensor. The one-dimensional distance from the center of the cap ORF and of the IRES ORF to the center of the 3′ UTR marked by the MS2 signal is 8.5 kb and 3 kb, respectively (Fig. 1a). Assuming cap and IRES ribosomes initiate stochastically, their average positions provide an approximation for the center of each ORF. This allowed us to measure the distance between the centers of the IRES ORF, cap ORF and 3′ UTR, all within single translation sites (Fig. 2a,b and Extended Data Fig. 3).

We began with cap-only and IRES-only translation sites, to determine whether they differ in size. In contrast to this, the median distance between cap-dependent ribosomes and the 3′ UTR in cap-only sites was 159 nm, a value statistically indistinguishable from the 149 nm median distance we measured between IRES-mediated ribosomes and the 3′ UTR in IRES-only translation sites (Fig. 2c). This similarity suggests that when the IRES ORF is not being translated (as in cap-only sites), it is compact. Furthermore, by ranking translation sites by their total intensity (that is, total ribosomal content or degree of translation), we found that as the brightness of the cap-only or IRES-only signals increased, the distance between those signals and the MS2 signal marking the 3′ UTR also increased (Fig. 2c). These data corroborate in living cells what the Zenklusen³⁷ and Parker³⁸ laboratories observed in fixed cells; namely, that translating ribosomes tend to stretch out mRNA. However, the similarity in the size of cap-only and IRES-only translation sites suggests that these features alone cannot account for the relatively low probability of IRES-mediated translation.

For completeness, we examined the size of cap + IRES translation sites (Fig. 2d). In these sites, the median distance between cap-dependent ribosomes and the 3′ UTR was 146 nm, similar to the 159-nm distance we measured in cap-only translation sites

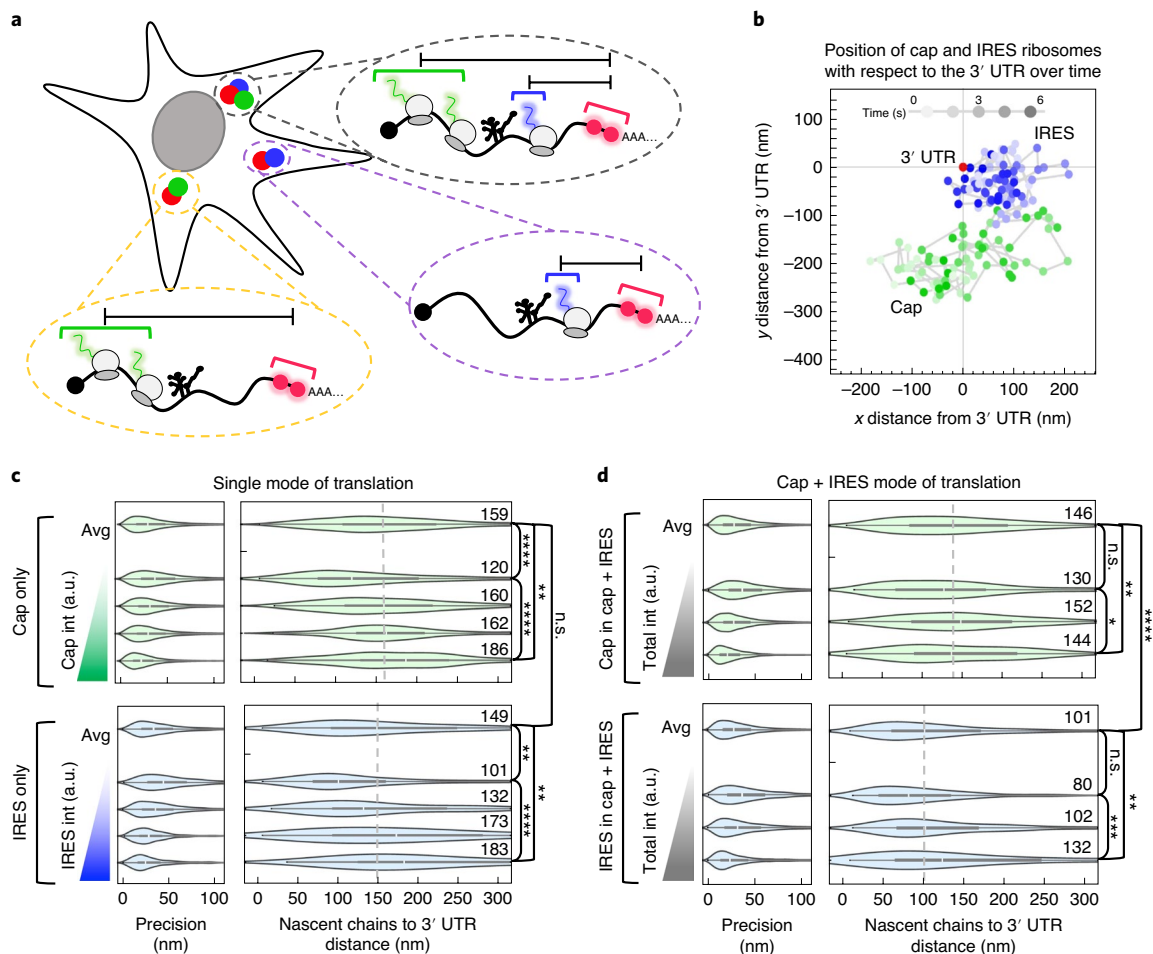


Fig. 2 | IRES and cap translation sites stretch out as ribosomes load. **a**, Schematic showing how the measurements from the 3' UTR to the cap and IRES nascent chains were conducted within single cells. **b**, Graph showing IRES and cap nascent-chain positions relative to the 3' UTR through time of a representative cap + IRES translation spot. Seventy-five frames were imaged at a rate of 77 msec per frame. **c**, Distributions of the distance between cap or IRES nascent chains and the 3' UTR in cap only (top, $n = 793$) and IRES only (bottom, $n = 213$) translation sites. In each box, the average of all translation sites is shown on top (Avg), and equal-sized subsets sorted by their total nascent-chain signal intensity below. Precision is estimated from the distribution of distances between two consecutive timepoints, for example any two connected points in **b**. The median distance is reported to the right of each distribution. **d**, Distributions of the distance between cap (top, $n = 296$) or IRES (bottom, $n = 259$) nascent chains and the 3' UTR in cap + IRES translation sites. On top of each distribution in **c** and **d**, the thin horizontal line denotes the 5–95% range, the thick horizontal line indicates the 25–75% range, and the white vertical line indicates the median. The P values are based on a two-tailed Mann-Whitney test: $^{*}P < 0.05$, $^{**}P < 0.01$, $^{***}P < 0.001$, $^{****}P < 0.0001$.

($P = 0.42$). In contrast, the median distance between IRES-mediated ribosomes and the 3' UTR was just 101 nm, significantly less than the 149 nm distance we measured in IRES-only translation sites ($P = 6 \times 10^{-6}$). These data indicate the upstream cap-dependent ribosomes restrict the freedom of downstream IRES-mediated ribosomes, causing them to spread out less. Here, it makes sense that IRES-mediated ribosomes tend to be closer to the 3' UTR than cap-dependent ribosomes are, because the IRES itself is considerably downstream of the cap. Finally, we again confirmed that as the brightness of translation signals increased, the distances between these signals and the MS2 signal marking the 3' UTR also increased (Fig. 2d).

The EMCV IRES recruits and initiates 2–3 times fewer ribosomes than does the cap. Having measured the prevalence, subcellular distribution and spatial organization of single EMCV IRES translation sites, we next focused on their dynamics. For this, we inhibited translation initiation using harringtonine⁴⁰ so all elongating ribosomes run-off each ORF and translation fluorescence signals

decay (Fig. 3 and Extended Data Fig. 4)⁴¹. Fits to the decays yielded similar run-off completion times of 45 ± 6 min for cap-dependent ribosomes versus 43 ± 17 min for IRES-mediated ribosomes (corresponding to relatively⁴² slow average elongation rates of 1.44 ± 0.40 aa s^{-1} and 1.81 ± 2.39 aa s^{-1} , respectively). Since these run-off times are similar, we conclude that elongation is not responsible for the low probability of observing IRES translation.

We next turned our attention to ribosome recruitment and initiation. To accurately measure these, we needed to compare the intensities of nascent-chain signals within translation sites. A direct comparison was not possible because the cap-dependent and IRES-mediated nascent chains differ in sequence and number of tags, and are labeled by complementary fluorophores and probes with different binding kinetics and quantum yields. To enable a fairer comparison, we developed a 'switch tag' in which the reporters were swapped (Fig. 4a). This allowed us to compare the same reporter under the control of both the cap (for example, in the original tag) and the IRES (in the switch tag). In this way, we could ensure differences in the intensity of translation sites would reflect

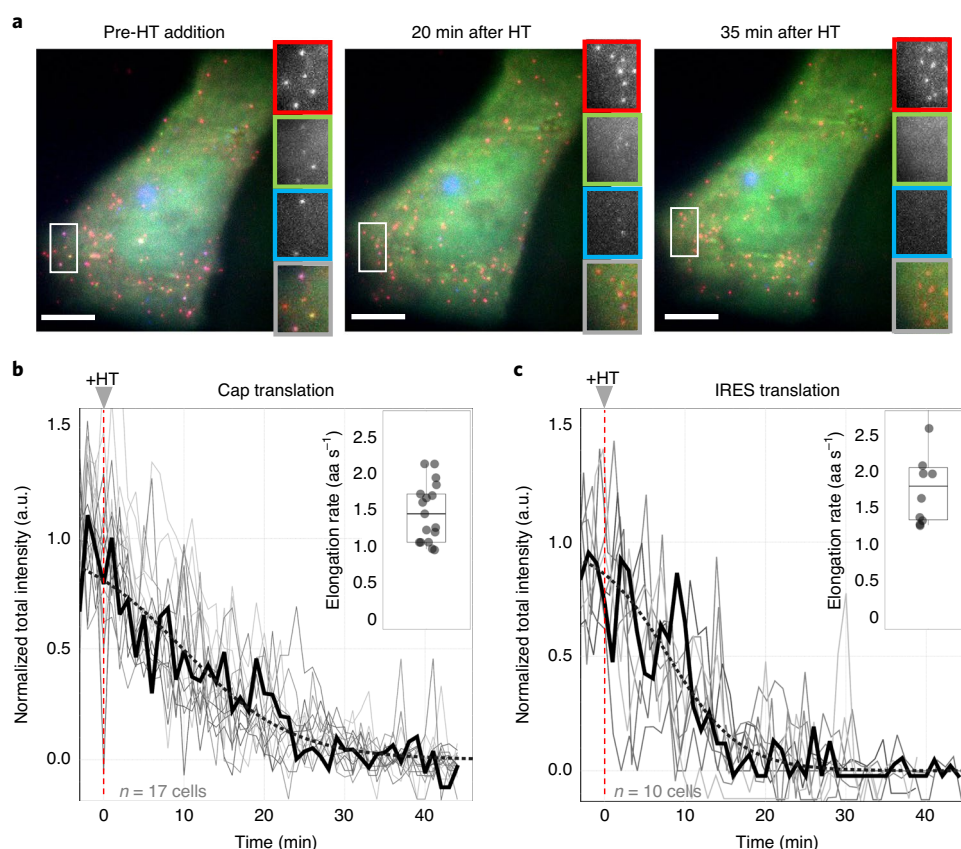


Fig. 3 | Elongation is not a rate-limiting step lowering the efficiency of IRES-mediated translation. **a**, Cells before harringtonine (HT) addition, 20 min after HT addition and 35 min after HT addition, with crops of the mRNA channel (red), cap channel (green), IRES channel (blue) and merge (gray). Scale bars, 10 μm . **b, c**, Normalized total intensity of nascent chains in cap-dependent (left) and IRES-mediated (right) translation sites. Each gray line represents a single cell treated with HT. The black line shows a representative cell. The dotted black line is a phenomenological fit of the representative cell. The inset shows the estimated elongation rates of each cell in amino acids per second (aa s^{-1}). The thick black line indicates the median. The box indicates the 25–75% range, and the whiskers indicate the 5–95% range. All cells were imaged for 45 min, with a 1-min interval between each capture. Harringtonine was added after 5 captures, marked by the red dotted line at time point 0. Intensity values are in arbitrary units (a.u.). $n=17$ cells for cap translation, $n=10$ cells for IRES translation.

differences in ribosome recruitment or initiation dynamics rather than differences in the kinetics of fluorophore or probe detection, or codon biases within epitope tags.

Reassuringly, when the switch tag was expressed in cells, it yielded nearly the same percentages of each type of translation site as the original tag did (Extended Data Fig. 5a), demonstrating the 10 $\times$ FLAG and 24 $\times$ SunTag reporters do not interfere with translation dynamics and have similar detection efficiencies. A direct comparison of the intensity of translation sites encoding 10 $\times$ FLAG-KDM5B initiated in a cap-dependent manner (from the original tag) versus an IRES-mediated manner (from the switch tag) gave a median intensity ratio of 2.1 ± 0.1 (Fig. 4b). Similarly, a direct comparison of the intensity of translation sites encoding 24 $\times$ SunTag-Kif18b initiated in a cap-dependent manner (from the switch tag) versus an IRES-mediated manner (from the original tag) gave a median intensity ratio of 2.8 ± 0.2 (Fig. 4b and Extended Data Fig. 5b)²⁶. The similarity of the ratios we measured indicates the presence of two to three times fewer ribosomes in IRES-mediated translation sites than in cap-dependent translation sites.

To obtain absolute ribosome occupancies, we developed a calibration construct that forms translation sites with a known number of ribosomes (further details in the Methods; Extended Data Fig. 5c). Comparing the intensity of these translation sites to 10 $\times$ FLAG-KDM5B translation sites in the original and switch tags (Fig. 4c) revealed that cap + IRES translation sites have a median of

13.6 cap-dependent ribosomes and a median of 9.4 IRES-mediated ribosomes, whereas cap-only translation sites have a median of 14.6 ribosomes ($P=0.196$), and IRES-only translation sites have a median of just 5.4 ribosomes ($P=5.83 \times 10^{-8}$). Thus, cap-dependent translation sites have more ribosomes than do IRES-mediated translation sites, consistent with the higher percentage of mRNA translated in a cap-dependent versus IRES-mediated manner. These data demonstrate that under normal physiological conditions, IRES-mediated translation of the biosensor is less productive than cap-dependent translation is, both at the population and single-molecule levels.

Computational modeling reveals ribosomal recruitment limits IRES translation. According to our experiments, the relatively low probability of IRES-mediated translation is due to rate-limiting steps that precede elongation, presumably either ribosome recruitment or initiation. To distinguish these possibilities, we developed a set of models with varying levels of complexity. All models consider the kinetics of individual ribosomes translating along an mRNA, with stochastic initiation and codon-dependent elongation proportional to the prevalence of the associated tRNA in the human genome⁴². Models differ in the number of states an mRNA can transition between: three-state models include an inactive mRNA state (S_{OFF}), an active mRNA state that allows cap translation ($S_{\text{CAP-ON}}$) and an active mRNA that allows IRES translation ($S_{\text{IRES-ON}}$). Four-state

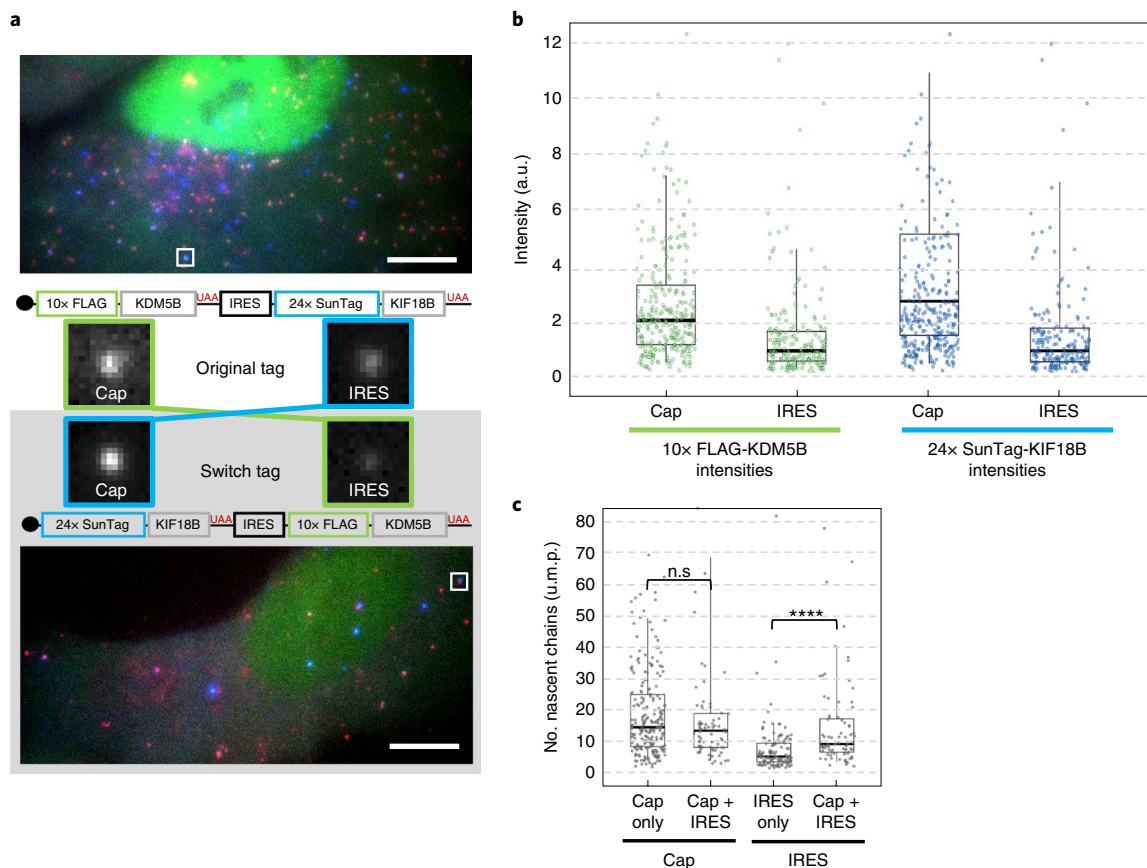


Fig. 4 | The cap recruits and initiates two to three times more ribosomes than does the IRES. **a**, One representative cell expressing the original tag (from $n=39$ cells) (top) or the switch tag (from $n=37$ cells) (bottom) with a cap + IRES translation spot highlighted by the white square. Scale bars, 10 μm . Crops of the representative sites are shown in the middle. The construct schematic with the corresponding crop illustrates how the intensity comparisons between cap and IRES were conducted. **b**, Box-and-whisker plots showing the intensity comparisons between cap and IRES. Left, intensity comparisons of 10 $\times$ FLAG-KDM5B nascent-chain signals from cap in the original tag ($n=302$ spots) and IRES in the switch tag ($n=167$ spots). Right, intensity comparisons of 24 $\times$ SunTag-KIF18B from cap in the switch tag ($n=262$ spots) and IRES in the original tag ($n=201$ spots). Intensity measurements are in arbitrary units (a.u.). **c**, Intensities of cap in cap-only (original tag) translation sites were compared to cap in cap + IRES (original tag), IRES in IRES only (switch tag) and IRES in cap + IRES (switch tag) to obtain numbers of ribosomes in units of mature protein (u.m.p.) on all types of translating species. Cap-only sites ($n=226$ spots) have a median of 14.6 ribosomes; cap + IRES sites ($n=76$ spots) have a median of 13.6 cap-dependent ribosomes and 9.4 IRES-mediated ribosomes; IRES-only sites ($n=121$ spots) have a median of 5.4 ribosomes. The P values are based on a two-tailed Mann-Whitney test: **** $P < 0.0001$. For the box-and-whisker plots, the thick black lines indicate the medians, the boxes indicate the 25–75% range and the whiskers indicate the 5–95% range.

models include an additional active mRNA state ($S_{\text{CAP+IRES-ON}}$) that allows both cap and IRES translation (Fig. 5a).

The stochastic dynamics for all models were simulated over large ranges of potential parameters and automated searches were conducted to identify combinations of mechanisms and parameters that maximize the likelihood of all data, including the fraction of translating spots (Fig. 1), harringtonine run-off kinetics (Fig. 3) and the translation-site intensity distributions (Fig. 4; also see Supplementary Note 1 and Fig. 5b–e). In total, we considered 14 unique models with between 7 and 12 free parameters, some of which included interdependence between cap and IRES translation, either in the form of enhanced transition rates between states or via reinitiation of ribosomes from cap to IRES (equations (1) and (2) in Supplementary Note 1 and Extended Data Fig. 6a,b). The simplest model that reproduces all data has 8 parameters (Fig. 5a and Table 1): (1) a baseline elongation rate of 1.7 aa s^{-1} , agreeing with our earlier estimate and consistent with previously measured rates^{43,44}; (2) an initiation rate ($k_{\text{INIT-C}}$) of $\sim 1/21 \text{ s}^{-1}$ for cap-dependent translation; (3) an initiation rate ($k_{\text{INIT-I}}$) of $\sim 1/20 \text{ s}^{-1}$ for IRES-mediated translation; (4) cap activation bursts with refractory periods ($1/k_{\text{ON-C}}$) of

34.5 min and (5) durations ($1/k_{\text{OFF-C}}$) of 8.3 min, leading to the synthesis of $k_{\text{INIT-C}}/k_{\text{OFF-C}} = 24$ nascent proteins on average per cap burst; (6) In the absence of cap, the model predicts that typical bursts of IRES translation would have a refractory period ($1/k_{\text{ON-I}}$) of 91.3 min and (7) a duration ($1/k_{\text{OFF-I}}$) of 2.5 min, leading to the synthesis of 7.5 nascent proteins on average per IRES burst. According to these fitted parameters, the efficiency of IRES translation is not limited by initiation (since $k_{\text{INIT-I}} \approx k_{\text{INIT-C}} \approx 1/20 \text{ s}^{-1}$), but rather the IRES spends less time in a translationally active state that can recruit ribosomes. In addition to the above seven parameters (which can be reduced to six by setting the cap and IRES initiation rates be equal), one additional parameter was required to fit the data: an enhancement in IRES activation when cap translation is on (that is, $k'_{\text{ON-I}} > k_{\text{ON-I}}$). Specifically, in the presence of cap, the IRES refractory period is reduced from 91.3 min to 11 min, leading to a 6.9-fold increase in IRES translation. This enhancement was required to capture the large percentage of cap + IRES translation sites (which is greater than what is predicted if cap and IRES translation were independent) (Fig. 1d, left) and the larger number of IRES-mediated ribosomes in cap + IRES translation sites compared to that in IRES-only

translation sites (Fig. 4c). These data and the best-fit model therefore provide evidence that translation of an upstream ORF can positively impact translation of a non-overlapping downstream ORF.

Predicting cap and IRES translation in response to specific cellular stresses. It is well known that viral infections cause increased levels of cellular stress. During stress, cap-dependent translation decreases, while viral RNAs continue to be translated, in part due to IRES-mediated ribosomal recruitment to viral RNAs. Extensive studies have shown that both viral and some endogenous IRES sequences remain translationally active during cellular stress^{13,15,16}.

To visualize the impact of stress on IRES-mediated translation at the single-molecule level, we exposed cells expressing our biosensor to sodium arsenite (NaAs)⁴⁵, which induces oxidative stress, and dithiothreitol (DTT)⁴⁶, which induces stress of the endoplasmic reticulum (ER). Because our reporter is bicistronic, the cap and IRES experience the same microenvironment during stress, thereby providing an internal control to fairly compare the impact of stress on cap versus IRES translation. Upon exposure to both types of stress, the intensity of cap-only translation sites decreased (Fig. 5f, left). In contrast, the intensity of IRES-only translation sites remained steady or increased (Fig. 5f, middle), and cap + IRES translation sites displayed an intermediate response (Fig. 5f, right). These data demonstrate that EMCV IRES translation is robust to cellular stress compared with cap translation, as is necessary for efficient viral translation in cells during infection.

We next used our best-fit model to predict the response to stress. We hypothesized stress decreases cap-dependent translation in one of two ways (Supplementary Note 1). Either translation is inhibited at the level of ribosome recruitment by blocking mRNA activation (by decreasing $k_{\text{ON-C}}$) (Fig. 5f), or translation is inhibited at the level of initiation (by decreasing $k_{\text{INIT-C}}$) (Extended Data Fig. 6e). We tested each mechanism assuming 33%, 67% and 100% reductions to the corresponding rate (Extended Data Fig. 6c,d). The best-fit models suggest that oxidative and ER stress affect cap-translation via slightly different mechanisms. NaAs stress is best predicted by blocking 100% of cap activation (log-likelihood of 187 ± 4 versus 582 ± 2 for the model in which cap initiation is blocked), whereas DTT stress is best predicted by blocking ~33% of cap initiation (log-likelihood of 599 ± 9 versus 1026 ± 52 for the model in which cap activation is blocked).

Discussion

Since their discovery in 1998 (ref. 47), IRES sequences have been studied intensely to elucidate their mechanisms to recruit ribosomes in a cap-independent manner¹. However, limited spatiotemporal resolution had prevented the real-time analysis of IRES-mediated

translation. To confront this problem, we created a unique bicistronic biosensor to quantify when, where and to what degree the EMCV IRES is translated at the single-molecule level in living cells. According to our data, the EMCV IRES is an excellent mimic of the cap, capable of being translated in similar subcellular environments, moving with similar kinetics, and sharing a similar underlying ribosomal organization upon translation. Furthermore, our computational fits reveal that, just like the cap, the EMCV IRES can initiate ribosome translation at a rate of ~1 ribosome every 20 s. However, despite these similarities, we find the IRES only recruits one ribosome for every two or three recruited to the cap under normal conditions. This inefficiency arises because the IRES spends less time than the cap in a translationally active state in which it is capable of recruiting ribosomes. Cellular stress reverses the situation, with the EMCV IRES continuing unperturbed, but the cap now spending more time in an inactive state. Our collective data therefore support a model in which the transition from a translationally inactive to active RNA state (capable of recruiting ribosomes) is the main factor controlling the balance between cap and IRES translation.

A hallmark of IRES-mediated translation is its dependence on a subset of host translation factors³¹. Due to these lax requirements, one would think that translation of the IRES could occur in special microenvironments that, for example, are enriched or depleted in specific translation factors. For example, EMCV IRES translation may occur around replication complexes³⁰. Using our biosensor, we find little evidence this process is facilitated by the IRES sequence alone. Instead, the EMCV IRES appears to be translated all throughout the cell cytoplasm in a manner that does not involve clustering and does not alter translation site mobility. This lack of distinction means the EMCV IRES does not require a specialized environment for translation. Furthermore, it demonstrates additional factors are needed to localize EMCV IRES translation during viral infection³⁰. In the future, it will be interesting to determine which factors are required for localization by creating biosensors that place the EMCV IRES in more natural monocistronic viral contexts.

According to our results, both the EMCV IRES and cap transition between translationally active and inactive states. Moreover, these transitions appear to be modulated to control translational output similar to how promoter activation and deactivation control transcriptional bursts⁴³. This general principle of regulation could be the result of sharing a common subset of translation factors. According to our best-fit model, bursts of IRES translation are both shorter in duration (2.5 min for IRES versus 8.3 min for cap) and separated by longer inactive refractory periods (91.3 min for IRES versus 34.5 min for cap) than are bursts of cap translation. Given the complex structure of the EMCV IRES⁹, which presumably undergoes dynamic changes, our results suggest that

Fig. 5 | Modeling bicistronic translation of the multicolor biosensor. a, The mathematical model considers four mutually exclusive RNA states: non-translating (S_{OFF}), cap-dependent ($S_{\text{CAP-ON}}$), IRES-mediated ($S_{\text{IRES-ON}}$) and both cap and IRES ($S_{\text{CAP+IRES-ON}}$), in which initiation can take place from the cap or IRES as indicated. Elongation and termination processes continue independently of RNA state. To capture interdependence between cap and IRES states, multiple hypotheses were tested, and the best model was selected after parameter optimization and model reduction (Supplementary Fig. 6c,d). The selected model considers four promoter states, in which the IRES activation rate depends on the cap state (model 4 S_{IM2}). k_{term} represents the termination rate. See Table 1 for further information on parameters. **b**, Mean values and s.d. for the model and mean values and s.e.m. for experimental data for the fraction of cap-dependent (Cap), IRES-mediated (IRES), both Cap-dependent and IRES-mediated (Cap + IRES) and non-translating (NT) spots. The prevalence of translation events are shown as the percentage of total RNA. For simulation, $n = 4,000$ trajectories were used; s.d. was calculated using bootstrapping ($\times 50$ with sampling of 300 trajectories). For experimental data, $n = 39$ cells. **c**, Experimental and model intensity distributions for cap-dependent and IRES-mediated translation. Distributions consider only the spots that have intensities greater than or equal to one u.m.p. **d,e**, Decrease in intensity after harringtonine application for cap-mediated translation spots (**d**) and IRES-mediated translation spots (**e**). To denote variability, ten independent model simulations are plotted in **d** and **e**. **f**, Experimental data and simulated predictions for translation inhibition by the chemical stressors NaAs and DTT. Chemical stressors were simulated by reducing the cap-activation rates at the RNA-state level (that is, blocking $k_{\text{ON-C}}$) for NaAs and by reducing cap initiation (that is, blocking $k_{\text{INIT-C}}$) rates for DTT. Experimental data are represented by the square symbols. Errors bars in the experimental data are the mean and s.e.m., and for the simulations, mean and s.d. NaAs, $n = 32$ cells. DTT, $n = 28$ cells. Simulations, $n = 4,000$ trajectories. The values given in the figure represent the percentage of inhibition. Cap, cap-only spots; IRES, IRES-only spots; and cap-IRES, cap translation intensity in spots with both cap and IRES intensities.

the IRES has trouble adopting and maintaining a conformation that can recruit ribosomes and support translation. In contrast, the cap relies on a larger set of factors, including the cap-binding protein eIF4E and scaffolding protein eIF4G. Presumably, these additional factors work together to better maintain a conformation that is attractive to ribosomes and more amenable to translation.

An interesting observation with our biosensor was that cap translation enhances IRES translation, but not the other way around. This makes sense given the subset of factors the IRES requires compared to the cap. When cap translation is on, all factors necessary for IRES translation are present at high concentrations. This would enhance the probability that the IRES gets translated. In contrast, when the IRES is on, not all factors required for cap translation are available,

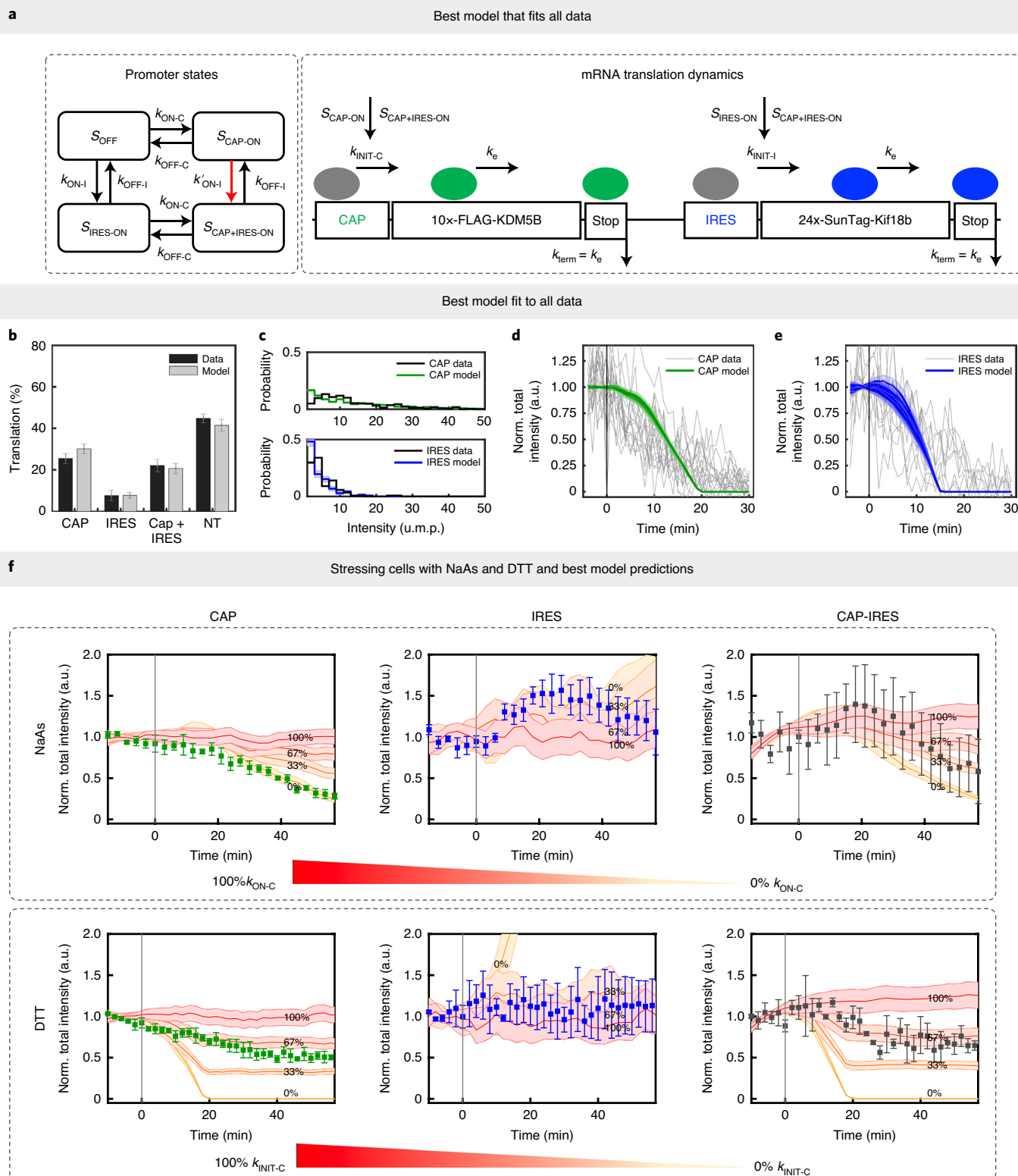


Table 1 | Estimated parameter values for the final selected model

Parameter	Description	Value
$k_{\text{INIT-C}}$	Initiation rate for cap	$4.8 \times 10^{-2} \pm 4.6 \times 10^{-2} \text{ s}^{-1}$
$k_{\text{INIT-I}}$	Initiation rate for IRES	$4.9 \times 10^{-2} \pm 5.3 \times 10^{-2} \text{ s}^{-1}$
$^a k_e$	Average elongation rate	$1.7 \pm 0.18 \text{ aa s}^{-1}$
$k_{\text{ON-C}}$	Transition rate from S_{OFF} to $S_{\text{CAP-ON}}$ or $S_{\text{IRES-ON}}$ to $S_{\text{CAP+IRES-ON}}$	$4.8 \times 10^{-4} \pm 9.7 \times 10^{-5} \text{ s}^{-1}$
$k_{\text{OFF-C}}$	Transition rate from $S_{\text{CAP-ON}}$ to S_{OFF} or $S_{\text{CAP+IRES-ON}}$ to $S_{\text{IRES-ON}}$	$2 \times 10^{-3} \pm 1.8 \times 10^{-3} \text{ s}^{-1}$
$k_{\text{ON-I}}$	Transition rate from S_{OFF} to $S_{\text{IRES-ON}}$	$1.8 \times 10^{-4} \pm 5.5 \times 10^{-5} \text{ s}^{-1}$
$k_{\text{OFF-I}}$	Transition rate from $S_{\text{IRES-ON}}$ to S_{OFF} or $S_{\text{CAP+IRES-ON}}$ to $S_{\text{CAP-ON}}$	$6.6 \times 10^{-3} \pm 2.7 \times 10^{-3} \text{ s}^{-1}$
$k'_{\text{ON-I}}$	Transition rate from $S_{\text{CAP-ON}}$ to $S_{\text{CAP+IRES-ON}}$	$1.5 \times 10^{-3} \pm 1.0 \times 10^{-3} \text{ s}^{-1}$

^a k_e is the elongation rate calculated as the average elongation of all codons. Four promoter states were proposed, where S_{OFF} represents a non-permissive initiation state, $S_{\text{CAP-ON}}$ allows for cap-dependent ribosomal initiation only, $S_{\text{IRES-ON}}$ allows for IRES-mediated initiation only, and $S_{\text{CAP+IRES-ON}}$ allows both cap-dependent and IRES-mediated initiation.

including eIF4E and eIF4G. Without these factors, cap-dependent translation is not enhanced.

The molecular mechanisms that govern the enhancement of IRES-mediated translation in the presence of cap-dependent translation in our biosensor remain unclear. One possibility given our live-cell confirmation that ribosomes stretch out translation sites is that the stretching alters the structure of the IRES. This could impact the IRES in a number of ways. The IRES could be stabilized (increased $k_{\text{OFF-I}}$), its folding could become faster (increased $k_{\text{ON-I}}$) or ribosomes coming off the cap could reinitiate at the IRES (the addition of a crossover rate, k_{CO}). According to our simulations, all of these improve the fits to our data, but faster folding alone was sufficient to improve the fit to near optimum values (Extended Data Fig. 6c). Thus, our data suggest that the stretching out of actively translated transcripts may help the IRES transition into a translationally active state.

Despite the lower overall translation efficiency of the EMCV IRES than that of the cap under normal conditions, the upside of relying on a subset of factors is IRES-mediated translation can persist and surpass cap-dependent translation during stress, a situation viruses have evolved in their ongoing arms race with eukaryotic cells. We see that in NaAs stress, IRES-mediated translation remains strong, presumably because this stress targets eIF4E²⁰, which is not required for IRES translation. Though IRES translation also remained strong compared with cap in DTT stress, the effect was smaller than with NaAs, presumably because DTT stress impacts a different set of translation factors than NaAs. In the future, it will be interesting to investigate which factors play the biggest roles and also which IRES sequences are most robust.

Our technology for monitoring IRES-mediated translation in living cells provides a new perspective on non-canonical translation that will complement technologies like ribosome profiling⁴⁴ and in vitro single-molecule assays⁴⁸. Our biosensor extends the breadth of NCT²⁷, which until now had been exclusively used to investigate cap-dependent translation^{27,29,46,49}. By incorporating IRES sequences in a bicistronic context, we have demonstrated how two distinct modes of translation can be fairly compared at the single-molecule level in living U2OS cells. This approach can be extended to study a variety of viral and eukaryotic IRES sequence in diverse cell types. This will help uncover the true breadth of IRES translation in vivo, but there are two important caveats to keep in mind. First, viral IRES sequences are not usually in a bicistronic context. Although

there are exceptions, such as the IRESs of the dicistroviridae⁵⁰, placing an IRES 3' of another ORF can alter its translation (as we saw in the enhanced IRES translation within cap + IRES translation sites). Second, IRES sequences (including EMCV) are usually part of uncapped viral RNA that never experience the cell nucleus. Capped bicistronic reporters could pick up nuclear factors that alter IRES translation. In the future, these caveats can be addressed by extending our technology to more natural IRES constructs, perhaps by loading or transfecting monocistronic RNA containing both a 5' IRES and repeat epitopes into cells or by infecting cells with engineered virions. Ultimately, as single-molecule experiments and computational analyses improve, we anticipate that integrated biosensors and stochastic models like those introduced here will provide new insights into not only how viral IRES sequences recruit ribosomes, but also how eukaryotic IRES elements function during development and cellular survival situations.

Online content

Any methods, additional references, Nature Research reporting summaries, source data, extended data, supplementary information, acknowledgements, peer review information; details of author contributions and competing interests; and statements of data and code availability are available at <https://doi.org/10.1038/s41594-020-0504-7>.

Received: 29 January 2020; Accepted: 12 August 2020;

Published online: 21 September 2020

References

- Jackson, R. J., Hellen, C. U. T. & Pestova, T. V. The mechanism of eukaryotic translation initiation and principles of its regulation. *Nat. Rev. Mol. Cell Biol.* **11**, 113–127 (2010).
- Bornes St  phanie et al. Translational induction of VEGF internal ribosome entry site elements during the early response to ischemic stress. *Circ. Res.* **100**, 305–308 (2007).
- Xue, S. et al. RNA regulons in Hox 5' UTRs confer ribosome specificity to gene regulation. *Nature* **517**, 33–38 (2015).
- Stoneley, M., Paulin, F. E., Le Quesne, J. P., Chappell, S. A. & Willis, A. E. C-Myc 5' untranslated region contains an internal ribosome entry segment. *Oncogene* **16**, 423–428 (1998).
- Ray, P. S., Grover, R. & Das, S. Two internal ribosome entry sites mediate the translation of p53 isoforms. *EMBO Rep.* **7**, 404 (2006).
- Firth, A. E. & Brierley, I. Non-canonical translation in RNA viruses. *J. Gen. Virol.* **93**, 1385–1409 (2012).
- Doudna, J. A. & Sarnow, P. Translation Initiation by Viral Internal Ribosome Entry Sites. **25** (2007).
- Komar, A. A., Mazumder, B. & Merrick, W. C. A new framework for understanding IRES-mediated translation. *Gene* **502**, 75–86 (2012).
- Kieft, J. S. Viral IRES RNA structures and ribosome interactions. *Trends Biochem. Sci.* **33**, 274–283 (2008).
- Filbin, M. E. & Kieft, J. S. Toward a structural understanding of IRES RNA function. *Curr. Opin. Struct. Biol.* **19**, 267–276 (2009).
- Baird, S. D. Searching for IRES. *RNA* **12**, 1755–1785 (2006).
- Fern  ndez-Miragall, O., de Quinto, S. L. & Mart  nez-Salas, E. Relevance of RNA structure for the activity of picornavirus IRES elements. *Virus Res.* **139**, 172–182 (2009).
- Gendron, K., Ferbeyre, G., Heveker, N. & Brakier-Gingras, L. The activity of the HIV-1 IRES is stimulated by oxidative stress and controlled by a negative regulatory element. *Nucleic Acids Res.* **39**, 902–912 (2011).
- Hanson, P., Yang, D., Zhang, H. & Hemida, M. in *Viral Replication* (ed Rosas-Acosta, G.) Ch. 5 (InTech, 2013).
- Holcik, M. & Sonenberg, N. Translational control in stress and apoptosis. *Nat. Rev. Mol. Cell Biol.* **6**, 318–327 (2005).
- Hanson, P. J. et al. IRES-dependent translational control during virus-induced endoplasmic reticulum stress and apoptosis. *Front. Microbiol.* **3**, 92 (2012).
- Hetz, C. The unfolded protein response: controlling cell fate decisions under ER stress and beyond. *Nat. Rev. Mol. Cell Biol.* **13**, 89–102 (2012).
- Hooper, P. L., Hightower, L. E. & Hooper, P. L. Loss of stress response as a consequence of viral infection: implications for disease and therapy. *Cell Stress Chaperones* **17**, 647–655 (2012).
- Fern  ndez, J., Yaman, I., Sarnow, P., Snider, M. D. & Hatzoglou, M. Regulation of internal ribosomal entry site-mediated translation by phosphorylation of the translation initiation factor eIF2  . *J. Biol. Chem.* **277**, 19198–19205 (2002).

20. Sonenberg, N. & Hinnebusch, A. G. Regulation of translation initiation in eukaryotes: mechanisms and biological targets. *Cell* **136**, 731–745 (2009).
21. Thompson, S. R. & Sarnow, P. Regulation of host cell translation by viruses and effects on cell function. *Curr. Opin. Microbiol.* **3**, 366–370 (2000).
22. Weingarten-gabbay, S. & Segal, E. Toward a systematic understanding of translational regulatory elements in human and viruses. *RNA Biol.* **13**, 927–933 (2016).
23. Plank, T. D. M., Whitehurst, J. T. & Kieft, J. S. Cell type specificity and structural determinants of IRES activity from the 5' leaders of different HIV-1 transcripts. *Nucleic Acids Res.* **41**, 6698–6714 (2013).
24. Davies, M. V. & Kaufman, R. J. The sequence context of the initiation codon in the encephalomyocarditis virus leader modulates efficiency of internal translation initiation. *J. Virol.* **66**, 9 (1992).
25. Gale, M., Tan, S.-L. & Katze, M. G. Translational control of viral gene expression in eukaryotes. *Microbiol. Mol. Biol. Rev.* **64**, 239–280 (2000).
26. De Quinto, S. L., Lafuente, E. & Martínez-Salas, E. IRES interaction with translation initiation factors: Functional characterization of novel RNA contacts with eIF3, eIF4B, and eIF4GII. *RNA* **7**, 1213–1226 (2001).
27. Morisaki, T. et al. Real-time quantification of single RNA translation dynamics in living cells. *Science* **352**, 1425–1429 (2016).
28. Viswanathan, S. et al. High-performance probes for light and electron microscopy. *Nat. Methods* **12**, 568–576 (2015).
29. Yan, X., Hoek, T. A., Vale, R. D. & Tanenbaum, M. E. Dynamics of translation of single mRNA molecules in vivo. *Cell* **165**, 976–989 (2016).
30. Carocci, M. & Bakkali-Kassimi, L. The encephalomyocarditis virus. *Virulence* **3**, 351–367 (2012).
31. Chamond, N., Deforges, J., Ulryck, N. & Sargueil, B. 40S recruitment in the absence of eIF4G/4A by EMCV IRES refines the model for translation initiation on the archetype of type II IRESs. *Nucleic Acids Res.* **42**, 10373–10384 (2014).
32. Bochkov, Y. A. & Palmenberg, A. C. Translational efficiency of EMCV IRES in bicistronic vectors is dependent upon IRES sequence and gene location. *BioTechniques* **41**, 283–292 (2006).
33. McNeil, P. L. & Warder, E. Glass beads load macromolecules into living cells. *J. Cell Sci.* **88**, 669–678 (1987).
34. Azzam, M. E. & Algranati, I. D. Mechanism of puromycin action: fate of ribosomes after release of nascent protein chains from polysomes. *Proc. Natl Acad. Sci. USA* **70**, 3866–3869 (1973).
35. Tokunaga, M., Imamoto, N. & Sakata-Sogawa, K. Highly inclined thin illumination enables clear single-molecule imaging in cells. *Nat. Methods* **5**, 159–161 (2008).
36. Cattoglio, C. et al. Determining cellular CTCF and cohesin abundances to constrain 3D genome models. *eLife* **8**, e40164 (2019).
37. Adivarahan, S. et al. Spatial organization of single mRNPs at different stages of the gene expression pathway. *Mol. Cell* **72**, 727–738 (2018).
38. Khong, A. & Parker, R. mRNA architecture in translating and stress conditions reveals an ordered pathway of mRNP compaction. *J. Cell Biol.* **217**, 4124–4140 (2018).
39. Svitkin, Y. V. et al. General RNA-binding proteins have a function in poly(A)-binding protein-dependent translation. *EMBO J.* **28**, 58–68 (2009).
40. Sharma, A. K. et al. A chemical kinetic basis for measuring translation initiation and elongation rates from ribosome profiling data. *PLoS Comput. Biol.* **15**, e1007070 (2019).
41. Morisaki, T. & Stasevich, T. J. Quantifying single mRNA translation kinetics in living cells. *Cold Spring Harb. Perspect. Biol.* **10**, a032078 (2018).
42. Aguilera, L. U. et al. Computational design and interpretation of single-RNA translation experiments. *PLoS Comput. Biol.* **15**, e1007425 (2019).
43. Munsky, B., Neuert, G. & van Oudenaarden, A. Using gene expression noise to understand gene regulation. *Science* **336**, 183–187 (2012).
44. Ingolia, N. T., Hussmann, J. A. & Weissman, J. S. Ribosome profiling: Global views of translation. *Cold Spring Harb. Perspect. Biol.* **11**, a032698 (2019).
45. Ruiz-Ramos, R., Lopez-Carrillo, L., Rios-Perez, A. D., De Vizcaya-Ruiz, A. & Cebrian, M. E. Sodium arsenite induces ROS generation, DNA oxidative damage, HO-1 and c-Myc proteins, NF- κ B activation and cell proliferation in human breast cancer MCF-7 cells. *Mutat. Res. Toxicol. Environ. Mutagen* **674**, 109–115 (2009).
46. Wang, C., Han, B., Zhou, R. & Zhuang, X. Real-time imaging of translation on single mRNA transcripts in live cells. *Cell* **165**, 990–1001 (2016).
47. Pelletier, J. & Sonenberg, N. Internal initiation of translation of eukaryotic mRNA directed by a sequence derived from poliovirus RNA. *Nature* **334**, 320–325 (1988).
48. Marshall, R. A., Aitken, C. E., Dorywalska, M. & Puglisi, J. D. Translation at the single-molecule level. *Annu. Rev. Biochem.* **77**, 177–203 (2008).
49. Wu, B., Eliscovich, C., Yoon, Y. J. & Singer, R. H. Translation dynamics of single mRNAs in live cells and neurons. *Science* **352**, 1430–1435 (2016).
50. Kanamori, Y. & Nakashima, N. A tertiary structure model of the internal ribosome entry site (IRES) for methionine-independent initiation of translation. *RNA* **7**, 266–274 (2001).

Publisher's note Springer Nature remains neutral with regard to jurisdictional claims in published maps and institutional affiliations.

© The Author(s), under exclusive licence to Springer Nature America, Inc. 2020

Methods

Plasmid construction. The original tag (SM-KDM5B-EMCV-SunTag-Kif18b-MS2) contains a SM with 10× FLAG epitopes, a SunTag with 24× SunTag epitopes and an MS2 repeat with 24× MS2 stem loops. The coding region of the SunTag and KIF18B was obtained by polymerase chain reaction (PCR) of a pCMV-SunTag-Kif18b-PP7 template (Addgene no. 128606), using the following primers: 5'-GCCGAAAGGTTTAAACGCTAGCTCTGGAGGAGAAGAAGCTT TTGAGCAAGAAT-3'; 5'-AGTAACAGTCCGCTAGGTCCTTATCGGA CACCTTGGT-3'. The PCR product contained arms of homology to the acceptor plasmid (SM-KDM5B-MS2; Addgene no. 81084). The acceptor plasmid was cut with NheI (New England BioLabs) between the end of KDM5B and the MS2 stem loops. The PCR product and cut acceptor plasmid were assembled via Gibson Assembly (homemade mixture). The resulting plasmid was SM-KD M5B-NheI-SunTag-Kif18b-MS2, which was also used as the NoIRES construct. The EMCV IRES sequence was amplified by PCR from EMCV_IRES_ pcDNA4TO_H2B_SunTag24x_v1 (Addgene no. 246719) using the following primers: 5'-CCGAAAGGTTTAAACGCTAGCACGTTACTGGCCGAA-3'; 5'-TTCTTCTCCTCCAGAGCTAGCTATTATCATCGTGTGTTTTCAAAG GAAA-3'. The PCR product contained arms of homology to the acceptor plasmid (SM-KDM5B-NheI-SunTag-Kif18b-MS2). The acceptor plasmid was cut with NheI (New England BioLabs) between the end of KDM5B and beginning of SunTag. The PCR product and cut acceptor plasmid were assembled via Gibson Assembly. The start codon for SunTag-Kif18b is within the EMCV IRES sequence.

For the construction of the Switch Tag (SunTag-Kif18b-EMCV-SM-KDM 5B-MS2), the coding region of the SunTag and KIF18B was obtained by PCR of a pCMV-SunTag-Kif18b-PP7 template (Addgene no. 128606), using the following primers: 5'-TCGCTGTGATCGTCACTTGGCGGACACCATGGAAGA ACTTTTGAGCAAGAAT-3'; 5'-CGTCTTGTAGTCCATGGTGGCGGCGCG CCGTCTTAGATATCGGACACCTTG-3'. The PCR product contained arms o f homology to the acceptor plasmid (SM-KDM5B-MS2 Addgene no. 81084). The acceptor plasmid was cut with NotI (New England BioLabs) at the beginning of SM. The PCR product and cut plasmid were assembled via Gibson Assembly. The resulting plasmid was SunTag-Kif18b-NheI-SM-KDM5B-MS2. The EMCV IRES sequence was amplified by PCR from EMCV_IRES_pcDNA4TO_ H2B_SunTag24x_v1 (Addgene no. 246719) using the following primers: 5'-CCAAGGTGTCCGATATCTAAGACGCGGTTACTGGCCGAAGCGCGT-3'; 5'-CCTGTAGTCCATGGTGGCGGCGATATTATCATCGTGTGTTTTC AAGGAAAACAC-3'. The PCR product contained arms of homology to the acceptor plasmid (SunTag-Kif18b-AscI-SM-KDM5B-MS2). The acceptor plasmid was cut with AscI (New England BioLabs) between the end of KIF18B and beginning of SM. The PCR product and cut acceptor plasmid were assembled via Gibson Assembly. The start codon for SM-KDM5B is within the EMCV IRES sequence.

Anti-FLAG Fab generation and dye conjugation. Pierce mouse IgG1 preparation kit (Thermo Fisher Scientific) was used to generate Fab according to the manufacturer's instruction. Briefly, immobilized ficin in the presence of 25 mM cysteine was used to digest FLAG antibodies (Wako, 012-22384 Anti DYKDDDDK mouse IgG2b monoclonal) to create Fab. Fabs were separated from the Fc region using NAb Protein A column. After elution, Fabs were concentrated to 1 mg ml⁻¹ and conjugated to Cy3. Cy3-N-hydroxysuccinimide ester (Invitrogen) was dissolved in DMSO and stored at -20°C. Then, 100 µg Fab was diluted into 100 µl of 100 mM NaHCO₃ (pH 8.5). Next, 1.33 µl of Cy3 was added to this solution and incubated with end-over-end rotation for 1–2 h at room temperature. The conjugated Fabs were then eluted from a PBS pre-equilibrated PD-mini G-25 desalting column (GE Healthcare) that removed unconjugated dye. Conjugated Fabs were then concentrated using an Amicon Ultra-0.5 Centrifugal Filter Unit (NMWL 10 kDa; Millipore) to 1 mg ml⁻¹. The degree of labeling (DOL) was calculated using the following formula:

$$DOL = \left(\frac{\epsilon_{Fab}}{\epsilon_{dye}} \right) \left(\frac{1}{(A_{280}/A_{dye}) - CF} \right)$$

where ϵ_{Fab} is the extinction coefficient of Fab (70,000 M⁻¹ cm⁻¹), ϵ_{dye} is the extinction coefficient of the dye used for conjugation (150,000 M⁻¹ cm⁻¹ for Cy3), A_{280} and A_{dye} are the measured absorbances of dye-conjugated Fab fragments at 280 nm and at the peak of the emission spectrum of the dye (570 nm for Cy3), respectively, and CF is the correction factor of the dye (the ratio of the absorbances of the dye alone at 280 nm to at the peak; 0.08 for Cy3).

MCP and scFv-GFP purification. Histidine-tagged MCP/scFv-GFP was purified with Ni-NTA Agarose (Qiagen) following the manufacturer's instructions with minor modifications. Briefly, the bacteria were lysed in a PBS-based buffer containing a complete set of protease inhibitors (Roche), and binding to the Ni-NTA resin was carried out in the presence of 10 mM imidazole. After washing with 20 and 50 mM imidazole in PBS, the protein was eluted with 300 mM imidazole in PBS, and directly used for experiments. The rest was dialyzed against a HEPES-based buffer (10% glycerol, 25 mM HEPES pH 7.9, 12.5 mM MgCl₂,

100 mM KCl, 0.1 mM EDTA, 0.01% NP-40 detergent, and 1 mM DTT) and stored at -80°C after snap-freezing by liquid nitrogen.

Cell culture, transfection and bead loading. U2OS cells were grown in DMEM (Thermo Fisher Scientific) supplemented with 10% (vol/vol) FBS, 1 mM L-glutamine and 1% (vol/vol) penicillin–streptomycin (DMEM+). One to two days prior to experiments, cells were plated into a 35-mm MatTek chamber at approximately 70–80% confluency. Two to four hours prior to experiments, cells were put in Opti-MEM (Thermo Fisher Scientific) supplemented with 10% (vol/vol) FBS (Opti-MEM+). Cells were then bead-loaded with fluorescently labeled Fab, GFP-fused scFv, MCP-HaloTag protein and purified DNA of interest. Briefly, 100 µg ml⁻¹ of fluorescently labeled Fab, 100 µg ml⁻¹ of purified GFP-fused scFv, 33 µg ml⁻¹ of purified MCP-HaloTag protein and 750 ng of DNA of interest were prepared in a total volume of 4 µl of 1×PBS. After removing Opti-MEM and FBS, the 4-µl solution was pipetted to the top of the cells. Then, ~106 µm glass beads (Sigma Aldrich) were sprinkled evenly over the cells. The chamber was tapped firmly 12 times on the bench, and Opti-MEM+ was added back to the cells. Two hours after bead-loading, cells were washed twice with phenol-red-free DMEM+ such that all beads were removed. 200 nM of JF646-HaloTag ligand was next added (1 µl of 200 nM to 1 ml of phenol-red-free DMEM+). After 20 min of incubation at 37°C, the cells were washed twice with phenol-red-free DMEM+ to remove excess ligand. Then, 2 ml of phenol-red-free DMEM+ was added back to the cells. Translation experiments were conducted immediately after washing. U2OS cells were purchased from ATCC and were authenticated by STR profiling by ATCC and morphological assessments. We also confirmed that all cell lines tested negative for mycoplasma contamination.

Single-molecule tracking microscopy. To track single-molecule mRNA translation events, we used a custom-built widefield fluorescence microscope with a highly inclined illumination scheme^{27,35}. Briefly, the excitation beams, 488-, 561- and 637-nm solid-state lasers (Vortran), were coupled and focused on the back focal plane of the objective (×60, NA-1.49 oil immersion objective, Olympus). The emission signals were split by an imaging grade, ultra-flat dichroic mirror (T660lpxr, Chroma) and detected by two aligned EM-CCD cameras (iXon Ultra 888, Andor) by focusing with 300-mm tube lenses (this lens combination produces 100 images with 130 nm per pixel). Live cells were placed into an incubation chamber (Okolab) at 37°C and 5% CO₂ on a piezoelectric stage (PZU-2150, Applied Scientific Instrumentation). The focus was maintained with the CRISP Autofocus System (CRISP-890, Applied Scientific Instrumentation). Image acquisition was performed using open source Micro-Manager³¹. With this setting, one camera detected far-red emission signals, while the other detected either red or green emission signals.

Far-red signals were excited with the 637-nm laser with a 731/137-nm emission filter (FF01-731/137/25, Semrock). Red and green signals were separated by the combination of the excitation lasers and the emission filters installed in a filter wheel (HS-625 HSFw TTL, Finger Lakes Instrumentation); namely, the 561-nm laser and 593/46-nm emission filter (FF01-593/46-25, Semrock) were used for Cy3 imaging, and the 488-nm laser and 510/42-nm emission filter (FF01-510/42-25, Semrock) were used for sfGFP or A488 imaging. The lasers, filter wheel, cameras and the piezoelectric stage were synchronized by an Arduino Mega board (Arduino). The exposure time of the cameras was selected as 53.64 msec throughout the experiments. The readout time for the cameras from the combination of imaging size, readout mode and the vertical shift speed was 23.36 msec, resulting in an imaging rate of 13 Hz (77 msec per image). The excitation laser lines were digitally synched to ensure that they only illuminated cells when the camera was exposing to avoid excessive photobleaching. To capture the entire volume of the cytoplasm of U2OS cells, 13 z stacks with a step size of 500 nm (6 µm in total) were acquired using the piezoelectric stage. Because one image of Cy3 was captured on one camera and one image of sfGFP/A488 + JF646 was captured on the other camera in the same stack of the cell, the z position within the cell changed every two images. The position of the filter wheel was changed during the camera readout time. This resulted in a total cellular imaging rate of 0.5 Hz (2 s per volume for 3 colors). Note that all colors described in the text and that are shown in the figures are based on the color of the excitation laser: RNA in red (JF646) and protein in green (Cy3) or blue (sfGFP).

Cell imaging conditions with no drugs added for all constructs.

Cells bead-loaded with SM-KDM5B-EMCV-SunTag-Kif18b-MS2 (Original Tag), SunTag-Kif18b-EMCV-SM-KDM5B-MS2 (Switch Tag) or SM-KDM5B-SunTag-Kif18b-MS2 (NoIRES Tag), Cy3-labeled anti-FLAG Fab, Halo-MCP protein (labeled with JF646-HaloTag ligand), and anti-SunTag scFv-GFP were imaged with a 6-s interval between every 13 captures (one entire cell volume) for 25–50 total timepoints. Laser powers for all images were: 15 mW for 637 nm, 9 mW for 488 nm and 5 mW for 561 nm with an ND10 neutral density filter at the beam expander.

Particle tracking. Collected images were first preprocessed with Fiji³². Briefly, the three-dimensional images were projected to two-dimensional (2D) images by a maximum-intensity projection and were background subtracted. Postprocessed

images were then analyzed by a custom-written Mathematica (Wolfram Research) routine to detect and track particles in the RNA channel (red color). Specifically, particles were emphasized with a band-pass filter such that the positions could be detected using the built-in Mathematica routine ComponentMeasurements 'IntensityCentroid'. Detected particles were linked through time by allowing a maximum displacement of 5 pixels between consecutive frames. Particle tracks lasting at least 5 frames were selected. To properly account for the offset between the two cameras, a geometric transformation function (see Methods below) was applied to the coordinates of the center of mRNAs. For each frame of each track, 15×15 (pixels $\times$ pixels) crops centered on the registered mRNA coordinate were made and averaged through time. Using Mathematica's band-pass filter and ComponentMeasurements described above, the time-averaged crops corresponding to each track were categorized on the basis of the presence of detectable signals in the green and blue nascent-chain channels: red, mRNA not translating; red + green = yellow, mRNA translating in cap only for original tag or IRES only for switch tag; red + blue = purple, mRNA translating in IRES only for the original tag and cap only for the switch tag; red + green + blue = white, mRNA translating in both cap and IRES manner. Once the spots were categorized in this automated fashion, all spots were again hand-checked to minimize error.

Finally, the original 2D maximum-intensity projected images corresponding to each hand-checked track were fit to find their precise coordinates and intensities (using the built-in Mathematica routine NonlinearModelFit) to a 2D Gaussians of the following form:

$$I(X, Y) = I_{BG} + Ie^{-\frac{(x-x_0)^2}{2\sigma_x^2} - \frac{(y-y_0)^2}{2\sigma_y^2}}$$

where I_{BG} is the background intensity, I the particle peak intensity, (σ_x, σ_y) the spread of the particle and (x_0, y_0) the particle location. From these data, the intensity, position through time and number of spots over time in each track were quantified for downstream analysis.

Fast imaging for mean square displacement analysis. For fast particle tracking to accurately quantify the mean square displacements, single planes of cells loaded with the original tag construct, Cy3 anti-FLAG Fab, anti-GCN4 scFv-GFP and Halo-MCP were imaged with an imaging rate of 77 msec.

Geometric transformation function. The offset between the two cameras was registered using the built-in Mathematica routine FindGeometricTransform. To find the transformation function that best aligned the fitted positions, 100-nm-diameter Tetraspeck beads evenly spread out across the image field-of-view were imaged on the same day that the experimental images were taken. Only the fitted particle positions were registered to avoid introducing any distortion into images. Therefore, a slight offset can be observed between the red and the green or blue particles, even though they are within a diffraction limited spot according to our registration.

Calibrating translation site intensity. We wanted to quantify u.m.p. (that is, the number of nascent chains or active ribosomes) at a translation site using its intensity signal. For this purpose, we imaged two calibration constructs²⁷. The two calibration constructs were equal in length, one containing the spaghetti monster 10 $\times$ FLAG tag (SM-BetaActin), which contains ten repeats of the FLAG epitope, and the other containing just a single FLAG epitope (1 $\times$ FLAG-filler-BetaActin). Note that the spaghetti monster 10 $\times$ FLAG tag (SM) is the same tag utilized in the original tag (SM-KDM5B-IRES-ST-Kif18b) and the switch tag (ST-Kif18b-IRES-SM-KDM5B). The 1 $\times$ FLAG-filler-BetaActin tag was used to measure the number of ribosomes translating in a translation site. With the 1 $\times$ FLAG-filler-BetaActin calibration construct, each nascent chain in a translation site contains just one FLAG epitope labeled by a single Fab conjugated (on average) to a single Cy3 fluorophore. By imaging this 1 $\times$ FLAG construct at high laser powers such that individual translation sites and single Cy3 fluorophores (confirmed by single-step photobleaching, see below) can both be visualized, the ratio of total Cy3 signal in translation sites to single Cy3 fluorophore intensity signals approximates the number of nascent chains (or ribosomes) per translation site. To quantify this, we imaged cells beadloaded with 1 $\times$ FLAG-filler-BetaActin and Cy3 anti-FLAG Fab in a single optical plane at high laser powers (50 mW for 561-nm and 15 mW for 637-nm laser). A short movie was acquired, after which cells were continually illuminated to photobleach them to the point at which single-probe fluorescence could easily be detected by single-step photobleaching. At this point, a second, short 250-frame movie was acquired. The intensity of polysomes (verified by the presence of an RNA signal intensity) from the first frame of the first movie was then measured (as described in the 'Particle tracking' section above) and compared with the plateau intensity of a single Cy3 just prior to single-step photobleaching. The ratio of polysome to Cy3 intensities gives us an estimate for the number of ribosomes on a single RNA. By averaging all measured RNA together, we obtain a mean value for the ribosomal occupancy of a single, translating 1 $\times$ FLAG-filler-BetaActin mRNA. From these measurements, 11.4 ± 2.0 ribosomes were estimated to be translating the 1 $\times$ FLAG-filler-BetaActin calibration construct.

Since the 1 $\times$ FLAG-filler-BetaActin calibration construct and the SM-BetaActin calibration construct (with 10 $\times$ FLAG) are the same length with the same promoters and 3' and 5' UTRs, their translation sites should contain roughly the same number of ribosomes (11.4 ± 2.0). With a known number of ribosomes on SM-BetaActin, we wished to quantify the number of ribosomes on the cap ORF in the original tag (SM-KDM5B-IRES-ST-Kif18b) and the IRES ORF in the switch tag (ST-Kif18b-IRES-SM-Kif18b). To do this, we imaged cells in two different chambers. In one chamber, we beadloaded cells with anti-FLAG Fab (Cy3) and SM-BetaActin. In the second chamber, we beadloaded cells with anti-FLAG (Cy3) and the original tag (SM-KDM5B-IRES-ST-Kif18b). Both chambers were imaged on the same day with the same imaging conditions (50 mW for 561 nm and 15 mW for 637 nm laser). By taking the intensity ratio of SM-BetaActin containing 11.4 ± 2.0 ribosomes and cap only translation sites in the original tag (SM-KDM5B-IRES-ST-Kif18b), we measured the ribosomal occupancy of the cap ORF to be 14.6 ± 5.6 ribosomes. Taking the intensity ratio of these translation sites and all other SM translation sites in the original tag (cap in cap + IRES translation sites) and switch tag (ST-Kif18b-IRES-SM-KDM5B) (IRES in IRES only and cap + IRES translation sites) gave the number of ribosomes translating in all possible translation sites, as shown in Fig. 4c.

Ribosome run-off experiments using harringtonine treatment and elongation estimates. To measure average elongation rates, cells beadloaded with the original tag (SM-KDM5B-EMCV-SunTag-Kif18b-MS2), Cy3-labeled anti-FLAG Fab, Halo-MCP protein (labeled with JF646-HaloTag ligand) and anti-SunTag scFv-GFP were imaged with a 60-s interval between every 13 frames (1 entire cell volume) for 50 total time points. Laser powers were the same as previously described for general imaging. After acquiring 5 time points of pretreated images, cells were treated with a final concentration of $3 \mu\text{g ml}^{-1}$ of harringtonine (Cayman Chemical). After treatment, cells were imaged for the remaining 45 time points as described. As a photobleaching control, cells were imaged at the exact same imaging conditions described previously however no drug was added.

To generate ribosomal run-off curves, images were analyzed with the particle tracker as previously described. In each frame of each cell image, nascent-chain signal intensities from all translation sites were totaled, resulting in an intensity decay curve over time for each individual cell. Each decay curve was normalized to the average value from the first five frames (preceding drug addition). Each individual curve was fit to the following phenomenological equation:

$$\frac{1 - \text{Tanh}(ax - b)}{2}$$

where the linear part of the fit (the slope at $ax = b$) provides a good estimate of the elongation rates in amino acids over time in seconds⁴¹. From this, elongation rates for each cell were calculated.

Puromycin treatment. Cells bead-loaded with the original tag (SM-KDM 5B-EMCV-SunTag-Kif18b-MS2) or the switch tag (SunTag-Kif18b-EMCV-SM-KDM5B-MS2), Cy3-labeled anti-FLAG Fab, Halo-MCP protein (labeled with JF646-HaloTag ligand), and scFv-GFP were imaged with a 60-s interval between every 13 frames (1 entire cell volume) for 15 total time points. After acquiring 5 time points of pretreated images, cells were treated with a final concentration of $50 \mu\text{g ml}^{-1}$ of puromycin. After treatment, cells were imaged for the remaining ten time points as described previously. As a photobleaching control, cells were imaged at the exact same imaging conditions described previously with no drug added. Three biological replicates were taken.

NaAs and DTT treatment. Cells beadloaded with the original tag (SM-KDM 5B-EMCV-SunTag-Kif18b-MS2) or switch tag (SunTag-Kif18b-EMCV-SM-KDM 5B-MS2), Cy3-labeled anti-FLAG Fab, Halo-MCP protein (labeled with JF646-HaloTag ligand) and anti-GCN4 scFv-GFP were imaged with a 180-s interval for NaAs and 120 for DTT between every 13 frames (1 entire cell volume) for 35 total time points. After acquiring 5 time points of pretreated images, cells were treated with a final concentration of 0.5 mM of NaAs or 0.75 mM of DTT. After treatment, cells were imaged for the remaining time points. As a photobleaching control, cells were imaged at the exact same imaging conditions described previously with no drug added. Four biological replicates were taken.

Statistics and Reproducibility. Figure 1c: Representative image from $n = 39$ independent biological replicates (cells).

Figure 1d: $n = 39$ independent biological replicates (cells) for the original tag and $n = 35$ independent biological replicates (cells) for the NoIRES Tag.

Figure 2b: Representative track out of 296 tracked cap + IRES translation sites (Figure 2c, top: Average of 296 tracked cap + IRES translation sites from 11 independent biological replicates (cells). The high-intensity group has 99 tracked mRNAs, the medium-intensity group has 99 tracked mRNAs and the low-intensity group has 98 tracked mRNAs.

Figure 2c, bottom: Avg of 259 tracked cap + IRES translation sites from 11 cells. The high-intensity group has 87 tracked mRNAs, the medium-intensity group has 86 tracked mRNAs and the low-intensity group has 86 tracked mRNAs.

Figure 2d, top: Average of 793 tracked cap-only translation sites from 11 independent biological replicates (cells). The high-intensity group has 199 tracked mRNAs, the medium-high-intensity group has 198 tracked mRNAs, the medium-low-intensity group has 198 tracked mRNAs and the low-intensity group has 198 tracked mRNAs.

Figure 2d Bottom: Average of 213 tracked cap-only translation sites from 11 cells. The high-intensity group has 53 tracked mRNAs, the medium-high-intensity group has 54 tracked mRNAs, the medium-low-intensity group has 53 tracked mRNAs and the low-intensity group has 53 tracked mRNAs.

Figure 3a: Representative cell from the 17 independent biological replicates (cells).

Figure 3b: $n = 17$ independent biological replicates (cells).

Figure 3c: $n = 10$ independent biological replicates (cells).

Figure 4a, top: Representative cell of original tag out of 39 independent biological replicates (cells).

Figure 4a, bottom: Representative cell of switch tag out of 37 independent biological replicates (cells).

Figure 4b, left to right: $n = 302$ spots out of 39 independent biological replicates (cells), $n = 167$ spots out of 37 independent biological replicates (cells), $n = 262$ spots out of 37 independent biological replicates (cells) and $n = 201$ spots out of 39 independent biological replicates (cells).

Figure 4c, left to right: 226 spots out of 39 independent biological replicates (cells), $n = 76$ spots out of 39 independent biological replicates (cells), $n = 121$ spots out of 37 independent biological replicates (cells) and $n = 76$ spots out of 37 independent biological replicates (cells).

Figure 5a: 14 unique 4 state models were considering with between 7 and 12 free parameters. The best model had 8 free parameters.

Figure 5b: Experimental data represent the fraction of translation spots weighted by the number of experimentally measured spots per cell. $n = 39$ independent biological replicates (cells). Simulations $n = 4,000$ trajectories. Simulated mean and s.d. values were calculated using bootstrapping ($\times 50$ with sampling of 300 trajectories).

Figure 5c: Experimental distributions were calculated from a total of $n = 226$ spots for cap and $n = 121$ for IRES. Simulations $n = 4,000$ trajectories. Simulated mean and s.d. values were calculated using bootstrapping ($\times 50$ with sampling of 1,000 trajectories).

Figure 5d,e: For experimental cap and IRES intensities $n = 10$ and $n = 17$ independent biological replicates (cells), respectively. Simulations $n = 4,000$ trajectories. Lines represent the mean and shadow bars represent the s.d., and ten independent repetitions are shown.

Figure 5f: NaAs: $n = 32$ independent biological replicates (cells). DTT: $n = 28$ independent biological replicates (cells). Simulations: $n = 4,000$ trajectories. Lines represent the mean and shadow bars represent the s.d.

Extended Data Fig. 3a: Representative data set out of $n = 296$ translation spots from $n = 11$ independent biological replicates (cells).

Extended Data Fig. 3b: Each point represents the median distance from the 3' UTR for either cap in green of IRES in blue within $n = 296$ cap + IRES translation sites.

Extended Data Fig. 6c,d: Relative log-likelihood values for the optimization process are calculated according to equation (23) (Supplementary Note 1). For the NaAs and DTT cross-validation experiments, log-likelihood values are calculated according to equation (26) (Supplementary Note 1). The log-likelihood reported are relative to the minimum value from all models. A selection threshold (dashed red line) was defined by a log-likelihood of 100 worse than the most complex and best-fitting model. Relative log-likelihood values over 500 are not plotted. Symbols represent and error bars represent mean values and s.d. of three independent optimization runs.

Extended Data Fig. 6e: NaAs: $n = 32$ independent biological replicates (cells). DTT: $n = 28$ independent biological replicates (cells). Model was simulated for 4,000 trajectories with a burn-in period of 10,000 s. Lines represent the mean and shadow bars represent the s.d.

Reporting Summary. Further information on experimental design is available in the Nature Research Reporting Summary linked to this article.

Data availability

Raw images can be found at: <https://doi.org/10.6084/m9.figshare.12751853.v1>. Source data are provided with this paper.

Code availability

All codes and required data are available at: https://github.com/MunskyGroup/Koch_Aguilera_et al_2020.git

References

- Edelstein, A. D. et al. Advanced methods of microscope control using μ Manager software. *J. Biol. Methods* **1**, e10 (2014).
- Schindelin, J. et al. Fiji: an open-source platform for biological-image analysis. *Nat. Methods* **9**, 676–682 (2012).

Acknowledgements

We thank L. Lavis for kindly providing JF646 labeled HaloTag ligand and H. Scherman for purifying Halo-MCP and GFP-scFv (anti-SunTag). We thank L. Whitehead and collaborators for the ImageJ Zoom plugin. We thank all members of the Stasevich and Munsky labs for their support and helpful discussions. B.M. and L.A. were supported by a grant from the W.M. Keck Foundation and by the NIH (grant no. 5R35GM124747). T.J.S., A.K. and T.M. were supported by the National Institutes of Health (grant no. R35GM119728).

Author contributions

A.K. and T.J.S. designed and planned all experiments. A.K. cloned all plasmids and performed all experiments. T.M. assisted A.K. with microscopy and particle tracking. B.M. and L.A. performed all modeling and fitting. T.J.S. and A.K. wrote the main manuscript, with assistance from T.M. for experimental methods related to microscopy and particle tracking and from B.M. and L.A. for computational sections. B.M. and L.A. wrote the computational details in Supplementary Note 1. A.K., L.A., T.M., B.M. and T.J.S. edited the manuscript. B.M. and T.J.S. acquired funding and designed the computational and experimental studies.

Competing interests

The authors declare no competing interests.

Additional information

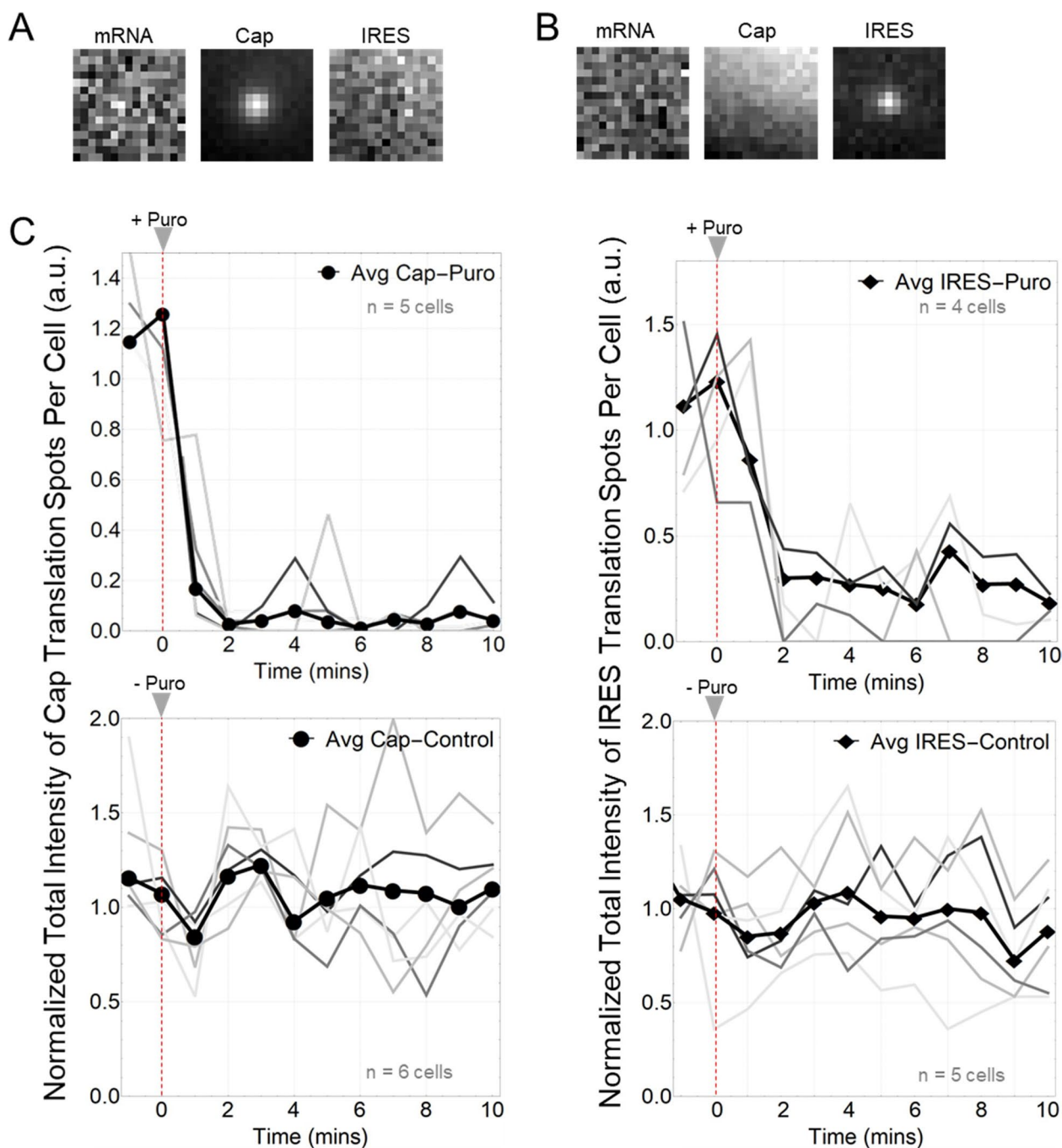
Extended data is available for this paper at <https://doi.org/10.1038/s41594-020-0504-7>.

Supplementary information is available for this paper at <https://doi.org/10.1038/s41594-020-0504-7>.

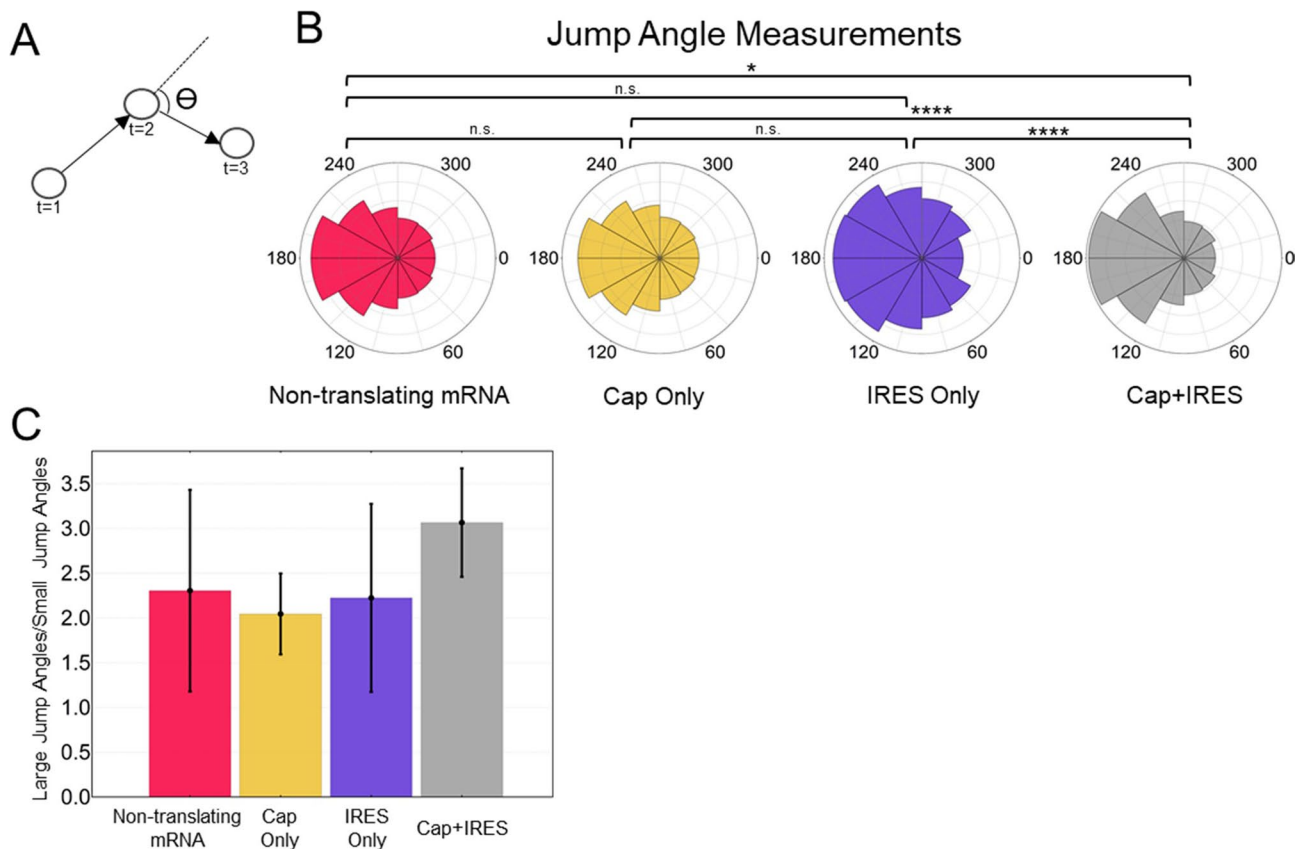
Correspondence and requests for materials should be addressed to B.M. or T.J.S.

Peer review information Peer reviewer reports are available. Anke Sparmann was the primary editor on this article and managed its editorial process and peer review in collaboration with the rest of the editorial team.

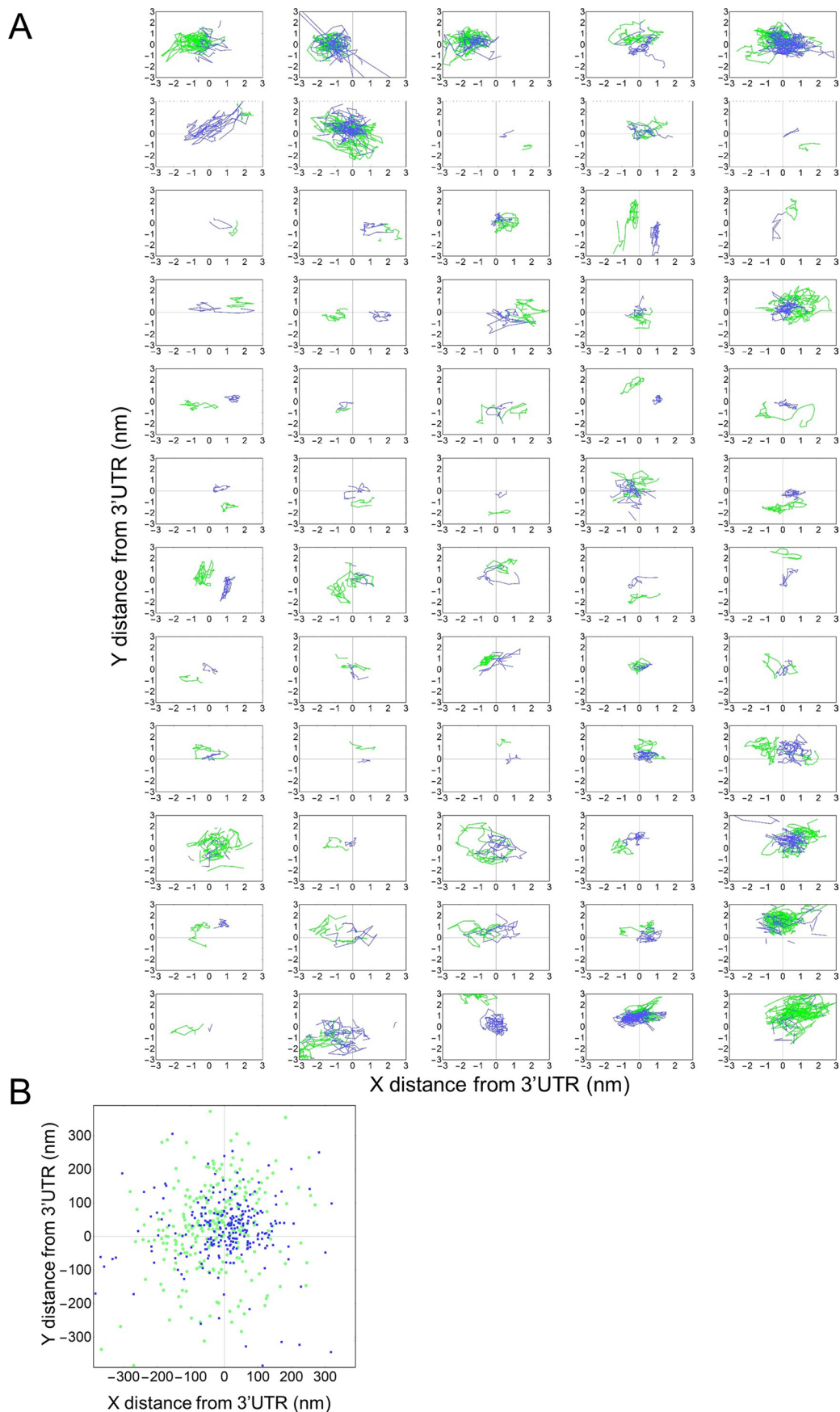
Reprints and permissions information is available at www.nature.com/reprints.



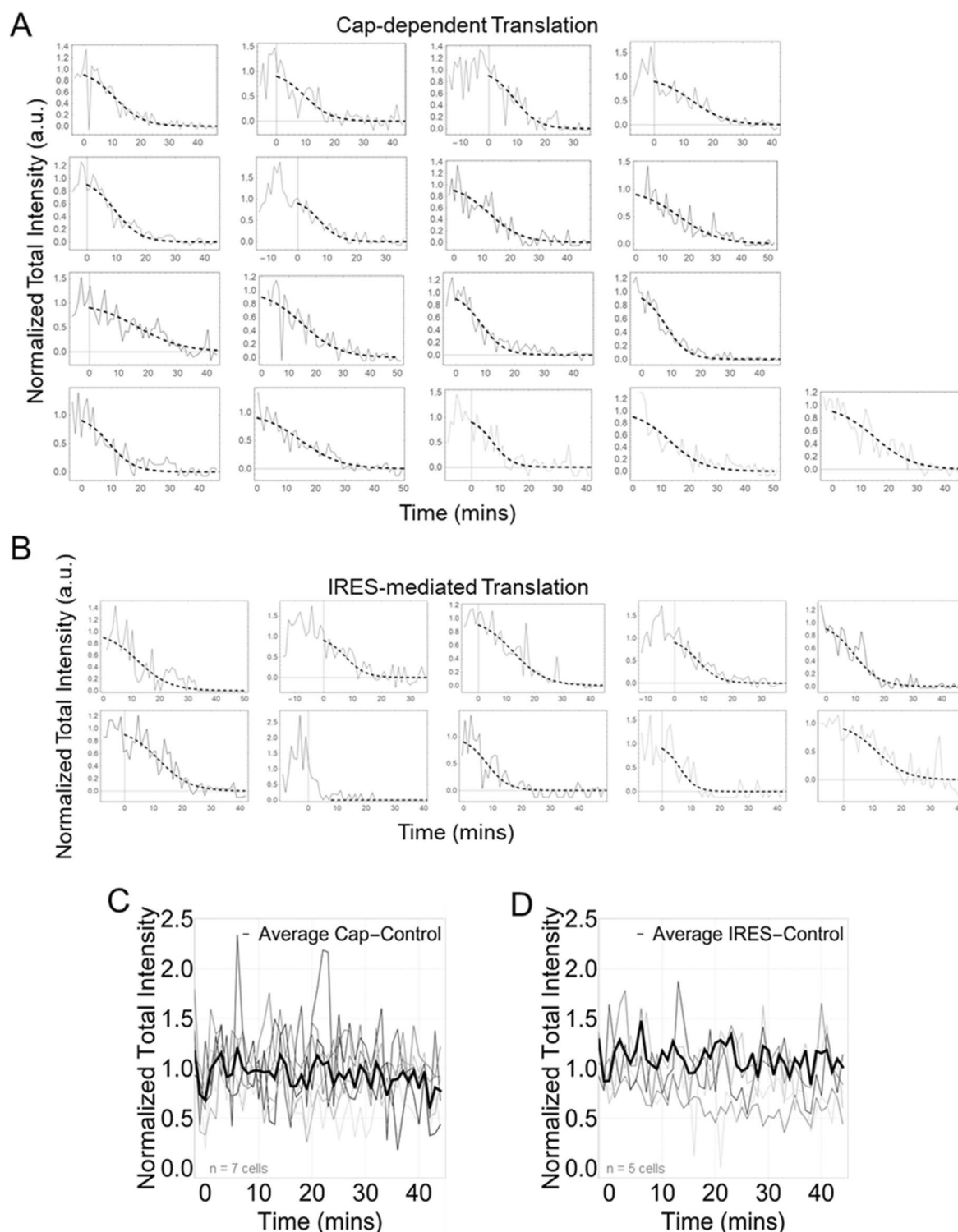
Extended Data Fig. 1 | Controls for bleedthrough and active translation. **a-b**, Five frame average of a Cap Only and IRES Only translation spots. mRNA marker dye, JF646, was not added to these cells. Cells were imaged for 3-minutes with a 6-second interval between each capture. **c**, Top graphs show normalized total intensity over time for Cap-dependent (left) and IRES-mediated translation spots (right), after addition of puromycin. Gray lines indicate individual cells. Thick dark line indicates the average total intensity of all cells. Red dashed lines indicate time at which puromycin was added. Cap-dependent: $n = 5$ cells. IRES-mediated: $n = 5$ cells. Bottom graphs show normalized total intensity of Cap-dependent (left) and IRES-mediated (right) translation spots without the addition of puromycin. Cap-dependent: $n = 6$ cells. IRES-mediated: $n = 5$ cells. All cells (control and drug treated) were imaged for 10-minutes with a 1-minute interval. Error bars represent S.E.M.



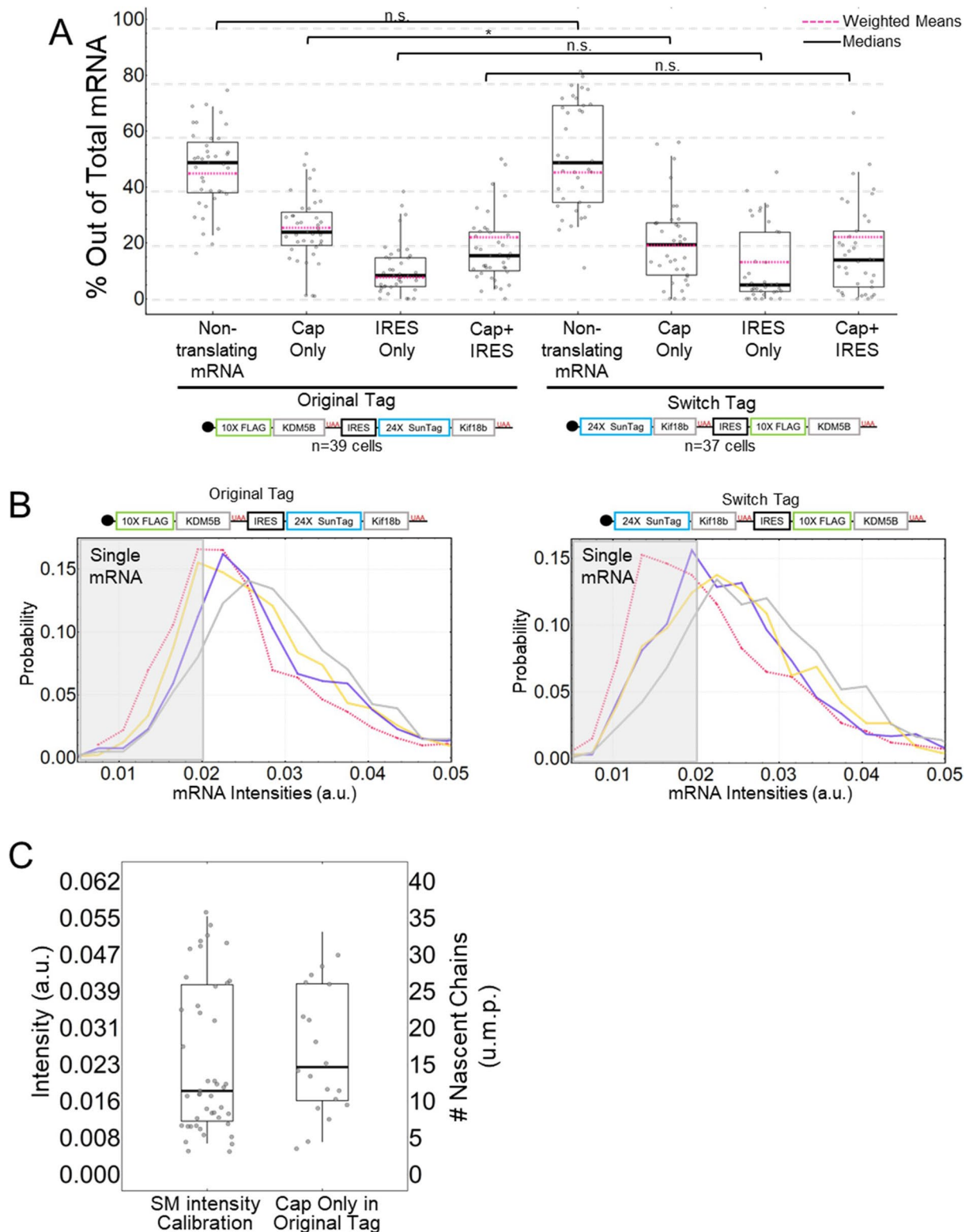
Extended Data Fig. 2 | IRES and cap translation site localization and mobility. **a**, Quantification of translating and non-translating mRNA distances in micrometers (μm) to nearest-neighbor translation spot within single cells. Each point represents the average distance per cell. $n = 39$ cells. **b**, Quantification of distance in μm from the nucleus of translating and non-translating mRNA. Each point represents the average distance from the edge of the nucleus per cell. $n = 39$ cells. **c**, Representative cell out of $n = 11$ cells imaged with fast imaging conditions. An example mRNA is highlighted with a white circle and a track through time of that mRNA is graphed below. **d**, Cumulative distribution function plot of non-translating mRNA (red), IRES Only (purple), Cap Only (yellow), and Cap+IRES (gray) species based on their diffusion coefficients ($\mu\text{m}^2/\text{sec}$). Inset shows the Mean Square Displacements (MSD) of the different species over time in seconds. $n = 3771$ total tracked mRNA (translating and non-translating), $n = 11$ cells. **e**, Schematic showing how the jump angles are measured. Error bars represent the standard error of the mean (S.E.M.). **f**, Circular plots of the jump angle distributions for non-translating mRNA, Cap Only, IRES Only and Cap+IRES translation sites. For the box and whisker plots, the thick black lines indicate the medians, the boxes indicate the 25%-75% range, and the whiskers indicate the 5%-95% range. The p-values are based on a two-tailed Mann-Whitney test: $*P < 0.05$, $**P < 0.01$, $***P < 0.001$, $****P < 0.0001$.



Extended Data Fig. 3 | Measuring distances between Cap and IRES nascent chains in Cap+ IRES translation spots. **a**, Representative data set of measured distances of Cap (light green) and IRES (blue) nascent chains to 3'UTR through time in single Cap+IRES translation tracks. **b**, Median distances of Cap and IRES nascent chains to 3'UTR of each Cap+IRES track. Distances are measured in nanometers (nm). 3' UTR coordinates were fixed at (0,0) for all analyses. $n = 296$ translation spots.

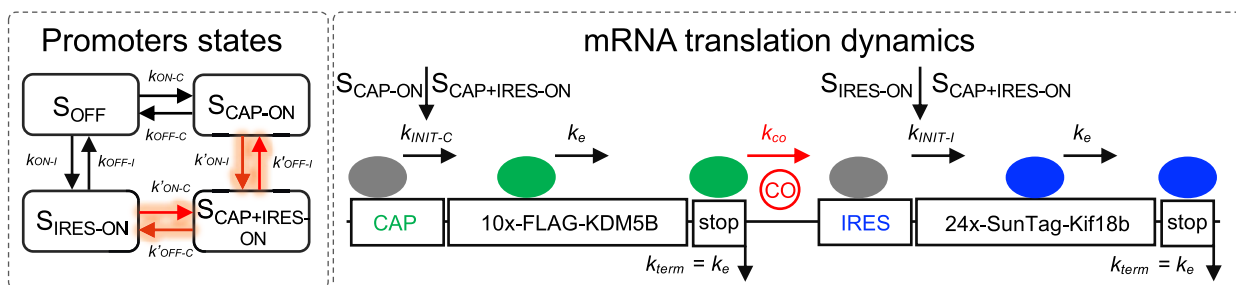


Extended Data Fig. 4 | Ribosomal run-off curves from single cells after addition of Harringtonine. **a**, Harringtonine-induced ribosomal run-off curves from single cells. Each curve shows the decay in nascent chain signal intensity from all Cap-dependent and **(b)** IRES-mediated translation sites within a single cell post-Harringtonine. Run-off curves were phenomenologically fit to a Tanh function to align curves in time for averaging in Fig. 4. The slope of fitted curves at a normalized intensity value of 0.5 was used to estimate the elongation rate. **c**, Cap-dependent ($n = 7$ cells) and **(d)** IRES-mediated ($n = 5$ cells) translation controls in which no drugs were added. Each gray line shows the total nascent chain signal intensity from all translation sites in an individual cell. The thick black line is a representative cell. Intensity in arbitrary units (a.u.). All cells were imaged for 45 minutes with a 1-minute interval between each capture.



Extended Data Fig. 5 | Original Tag comparison to Switch Tag, single mRNA selection, and polysome intensity calibrations. **a**, Quantification of the percentages of each type of translation sites for the Original Tag (left, $n=39$ cells) and the Switch Tag (right, $n=37$ cells). Each point represents a single-cell measurement. **b**, Probability histograms showing distributions of mRNA intensities of non-translating mRNA (Red), Cap Only (Yellow), IRES Only (Purple), and Cap+IRES (Gray) translation sites for the Original Tag and the Switch Tag. The gray boxes represent the mRNA intensity threshold used to eliminate multiple mRNAs. Intensities in arbitrary units (a.u.). **c**, Translation site calibration measurements. The intensities of Cap in Cap Only translation sites ($n=20$ spots) in the Original Tag were compared to a 10xFlag calibration system ($n=47$ spots) with a known number of ribosomes. These comparisons lead to a calculated number of 14.6 ribosomes in Cap Only translation sites using the Original Tag. For the box and whisker plots, the thick black lines indicate the medians (A and C), and the dashed red line indicate the weighted means (A) the boxes indicate the 25%-75% range, and the whiskers indicate the 5%-95% range. The p-values are based on a two-tailed Mann-Whitney test: * $p < 0.05$, ** $p < 0.01$, *** $p < 0.001$, **** $p < 0.0001$.

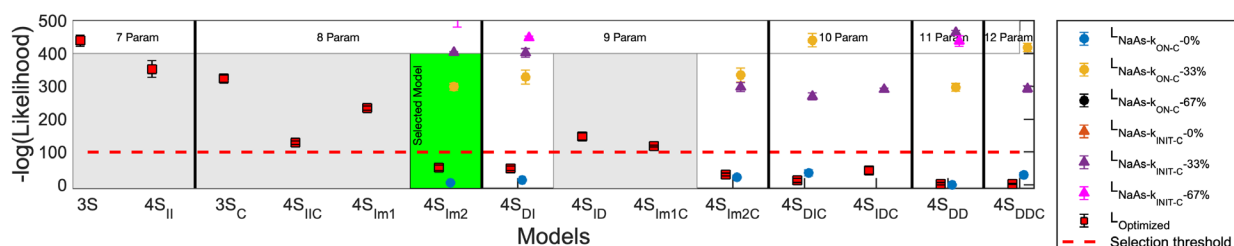
A) Most complex mathematical model



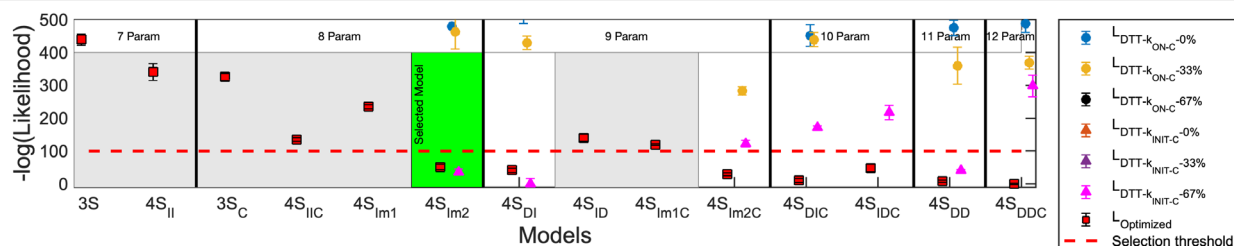
B) 14 tested models



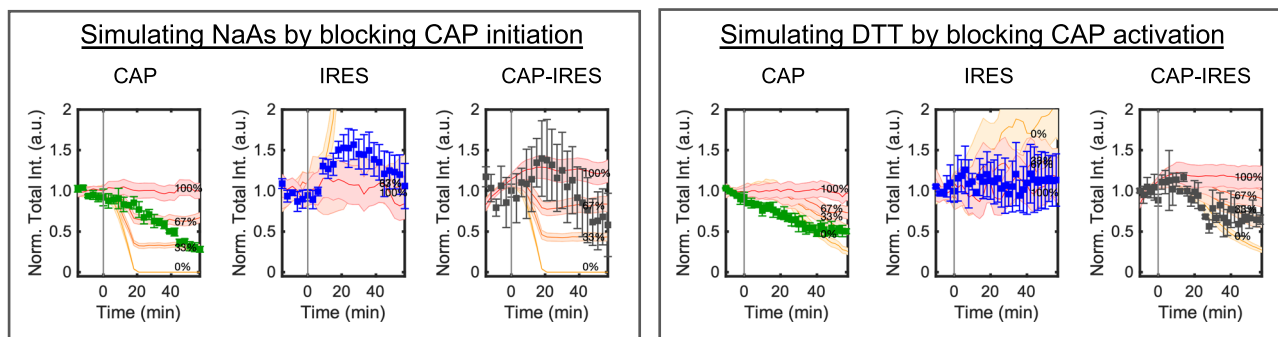
C) Optimization and cross-validation for NaAs stress



D) Optimization and cross-validation for DTT stress



E) Stressing cells with NaAs and DTT



Extended Data Fig. 6 | See next page for caption.

Extended Data Fig. 6 | Model of the bicistronic gene construct. a, The most complete mathematical model considers four mutually exclusive RNA states: non-translating (S_{OFF}), Cap-dependent ($S_{\text{CAP-ON}}$), IRES-mediated ($S_{\text{IRES-ON}}$), and both Cap and IRES ($S_{\text{CAP+IRES-ON}}$). All transition rate values between RNA states are free-independent parameters. A cross-over mechanism (CO symbol in the figure), by which a ribosome that completes the translation of the Cap-dependent protein could immediately reinitiate translation of the IRES-mediated protein, is represented by the reaction parameter k_{CO} . **b,** Comparison of 14 different sub-models. The sub-models test different hypotheses, including variations of the number of mRNA states (3 or 4 states), dependency on Cap and IRES switching states, and/or the existence of the cross-over mechanism. A complete description is given in the Supplementary Information (S.I.). **c,** Cross-validation is used to compare two possible mechanisms of translation inhibition under NaAs stress. The first mechanism mimics the inhibition of the Cap activation rates at the promoter level ($L_{\text{NaAs-k-ON-C}}$; that is, block of $k_{\text{ON-C}}$ and $k'_{\text{ON-C}}$). The second mechanism considers blocking ribosomal initiation for Cap ($L_{\text{NaAs-k-INIT-C}}$; that is, block of $k_{\text{INIT-C}}$). **d,** Optimization process and cross-validation for the DTT stress. The same inhibitory mechanisms described in C are tested for DTT stress. Relative Log-likelihood values for the optimization process are calculated according to (S.I.) Eq. 23 and Eq. 26 for the NaAs and DTT cross-validation experiments, respectively. A selection threshold (dashed red line) was defined by a log-likelihood of 100 worse than the most complex and best fitting model. Models above the selection threshold were discarded (gray background), and their cross-validation log-likelihood values are not shown. The best model shown (green background) was chosen as the model with fewest free parameters below the selection threshold. A complete description is given in the Statistics and Reproducibility section. **e,** Model simulations for the best-fit model $4S_{\text{im2}}$ under NaAs and DTT stresses. The figure shows the effect of blocking ribosomal initiation and activation for Cap.

Reporting Summary

Nature Research wishes to improve the reproducibility of the work that we publish. This form provides structure for consistency and transparency in reporting. For further information on Nature Research policies, see [Authors & Referees](#) and the [Editorial Policy Checklist](#).

Statistics

For all statistical analyses, confirm that the following items are present in the figure legend, table legend, main text, or Methods section.

- | | |
|-------------------------------------|--|
| n/a | Confirmed |
| ☐ | ☒ The exact sample size (n) for each experimental group/condition, given as a discrete number and unit of measurement |
| ☐ | ☒ A statement on whether measurements were taken from distinct samples or whether the same sample was measured repeatedly |
| ☐ | ☒ The statistical test(s) used AND whether they are one- or two-sided
<i>Only common tests should be described solely by name; describe more complex techniques in the Methods section.</i> |
| ☒ | ☐ A description of all covariates tested |
| ☐ | ☒ A description of any assumptions or corrections, such as tests of normality and adjustment for multiple comparisons |
| ☐ | ☒ A full description of the statistical parameters including central tendency (e.g. means) or other basic estimates (e.g. regression coefficient) AND variation (e.g. standard deviation) or associated estimates of uncertainty (e.g. confidence intervals) |
| ☐ | ☒ For null hypothesis testing, the test statistic (e.g. F , t , r) with confidence intervals, effect sizes, degrees of freedom and P value noted
<i>Give P values as exact values whenever suitable.</i> |
| ☐ | ☒ For Bayesian analysis, information on the choice of priors and Markov chain Monte Carlo settings |
| ☒ | ☐ For hierarchical and complex designs, identification of the appropriate level for tests and full reporting of outcomes |
| ☐ | ☒ Estimates of effect sizes (e.g. Cohen's d , Pearson's r), indicating how they were calculated |

Our web collection on [statistics for biologists](#) contains articles on many of the points above.

Software and code

Policy information about [availability of computer code](#)

Data collection MicroManager (1.4.22)

Data analysis Custom Mathematica code (11.3) and Fiji ImageJ

For manuscripts utilizing custom algorithms or software that are central to the research but not yet described in published literature, software must be made available to editors/reviewers. We strongly encourage code deposition in a community repository (e.g. GitHub). See the Nature Research [guidelines for submitting code & software](#) for further information.

Data

Policy information about [availability of data](#)

All manuscripts must include a [data availability statement](#). This statement should provide the following information, where applicable:

- Accession codes, unique identifiers, or web links for publicly available datasets
- A list of figures that have associated raw data
- A description of any restrictions on data availability

The datasets generated during and/or analysed during the current study are available from the corresponding author on reasonable request. All code used to analyze the data set will be available on GitHub.

Field-specific reporting

Please select the one below that is the best fit for your research. If you are not sure, read the appropriate sections before making your selection.

- ☒ Life sciences ☐ Behavioural & social sciences ☐ Ecological, evolutionary & environmental sciences

Life sciences study design

All studies must disclose on these points even when the disclosure is negative.

Sample size

Fig 1c: Representative image from n=39 independent biological replicates (cells).
 Fig 1d: n=39 independent biological replicates (cells) for the Original Tag and n=35 independent biological replicates (cells) for the NoIRES Tag.
 Fig 2b: Representative track out of 296 tracked Cap+IRES translation sites
 Fig 2c top: Avg of 296 tracked Cap+IRES translation sites from 11 independent biological replicates (cells). Most intense group has 99 tracked mRNA, the medium intense group has 99 tracked mRNA, and the least intense group has 98 tracked mRNA.
 Fig 2c bottom: Avg of 259 tracked Cap+IRES translation sites from 11 cells. Most intense group has 87 tracked mRNA, the medium intense group has 86 tracked mRNA, and the least intense group has 86 tracked mRNA.
 Fig 2d Top: Avg of 793 tracked Cap Only translation sites from 11 independent biological replicates (cells). Most intense group has 199 tracked mRNA, the most intense medium group has 198 tracked mRNA, the least medium intense group has 198, and the least intense group has 198 tracked mRNA.
 Fig 2d Bottom: Avg of 213 tracked Cap Only translation sites from 11 cells. Most intense group has 53 tracked mRNA, the most intense medium group has 54 tracked mRNA, the least medium intense group has 53, and the least intense group has 53 tracked mRNA.
 Fig 3a: Representative cell from the 17 independent biological replicates (cells)
 Fig 3b: n=17 independent biological replicates (cells).
 Fig 3c: n=10 independent biological replicates (cells).
 Fig 4a top: Representative cell of Original Tag out of 39 independent biological replicates (cells)
 Fig 4a bottom: Representative cell of Switch Tag out of 37 independent biological replicates (cells)
 Fig 4b from left to right: n= 302 spots out of 39 independent biological replicates (cells), n=167 spots out of 37 independent biological replicates (cells), n=262 spots out of 37 independent biological replicates (cells), n=201 spots out of 39 independent biological replicates (cells).
 Fig 4c from left to right: 226 spots out of 39 independent biological replicates (cells), n=76 spots out of 39 independent biological replicates (cells), n=121 spots out of 37 independent biological replicates (cells), n=76 spots out of 37 independent biological replicates (cells).
 Fig 5a: 14 unique 4 state models were considering with between 7 and 12 free parameters. The best model had 8 free parameters.
 Fig 5b-e: Model was simulated for 4,000 trajectories with a burn-in period of 10,000 seconds.
 Fig 5f: NaAs-n=32 independent biological replicates (cells). DTT-n=28 independent biological replicates (cells)
 Supplementary Fig 1c: n=5 (top, left), n=5 (top, right), n=6 (bottom, left), n=5 (bottom, right) independent biological replicates (cells).
 Supplementary Fig 2a: n=39 independent biological replicates (cells).
 Supplementary Fig 2b: n=39 independent biological replicates (cells).
 Supplementary Fig 2c: Representative cell of Original Tag out of n=11 independent biological replicates (cells). Below the image is a representative trace of a non-translating mRNA out of n=3771 total tracked mRNA translating and non-translating out of n=11 independent biological replicates (cells).
 Supplementary Fig 2d: n=3771 total tracked mRNA translating and non-translating from 11 independent biological replicates (cells).
 Supplementary Fig 3a: Representative data set out of n=296 translation spots from n=11 independent biological replicates (cells).
 Supplementary Fig 3b: Each point represents the median distance from the 3'UTR for either Cap in green of IRES in blue within n=296 Cap +IRES translation sites.
 Supplementary Fig 4c: n=7 independent biological replicates (cells).
 Supplementary Fig 4d: n=7 independent biological replicates (cells).
 Supplementary Fig 5a: n= 39 independent biological replicates (cells) for the Original Tag. n= 37 independent biological replicates (cells) for the Switch Tag.
 Supplementary Fig 5b: n=39 independent biological replicates for the Original Tag. n=37 biological replicates for the Switch Tag.
 Supplementary Fig 5c: n=47 spots for SM intensity Calibration from n=13 independent biological replicates (cells) and n=20 spots Cap Only in Original Tag from n=10 independent biological replicates (cells).

Data exclusions

Movies of cells that expressed too many reporter mRNAs were excluded because each mRNA cannot be tracked in these scenarios. For Harringtonine experiments, cells that were not expressing IRES-mediated translation were eliminated.

Replication

We confirmed reproducibility by performing at least 3 independent experimental replicates for each assay.

Randomization

This is not relevant to our study as we automated the analysis of microscopy data in an unbiased manner. We used consistent thresholding for mRNA and translation detection for each experiment.

Blinding

We used consistent thresholds to detect mRNAs and translation throughout all experimental conditions. Following detection, analysis was fully automated such that there was no bias from the experimenter involved.

Reporting for specific materials, systems and methods

We require information from authors about some types of materials, experimental systems and methods used in many studies. Here, indicate whether each material, system or method listed is relevant to your study. If you are not sure if a list item applies to your research, read the appropriate section before selecting a response.

Materials & experimental systems

n/a	Involved in the study
☐	☒ Antibodies
☐	☒ Eukaryotic cell lines
☐	☐ Palaeontology
☐	☐ Animals and other organisms
☐	☐ Human research participants
☐	☐ Clinical data

Methods

n/a	Involved in the study
☒	☐ ChIP-seq
☒	☐ Flow cytometry
☒	☐ MRI-based neuroimaging

Antibodies

Antibodies used	Anti-DYKDDDDK antibody: Manufacturer: Wako, Catalog number: 012-22384, Clone No. 1E6, Lot number: SAN4130. 100 micrograms/mL of fluorescently labeled antibody fragment was used for each assay.
Validation	We generated FLAG Fab fragments by digesting anti-DYKDDDDK antibody, and validated its functionality as described in Morisaki et al (Science 2016).

Eukaryotic cell lines

Policy information about [cell lines](#)

Cell line source(s)	U-2 OS cells from ATCC
Authentication	U-2 OS cells were authenticated by STR profiling (ATCC) and morphological assessments.
Mycoplasma contamination	n We confirmed that all cell lines tested negative for mycoplasma contamination.
Commonly misidentified lines (See ICLAC register)	No commonly misidentified lines were used.

Palaeontology

Specimen provenance	<i>Provide provenance information for specimens and describe permits that were obtained for the work (including the name of the issuing authority, the date of issue, and any identifying information).</i>
Specimen deposition	<i>Indicate where the specimens have been deposited to permit free access by other researchers.</i>
Dating methods	<i>If new dates are provided, describe how they were obtained (e.g. collection, storage, sample pretreatment and measurement), where they were obtained (i.e. lab name), the calibration program and the protocol for quality assurance OR state that no new dates are provided.</i>

☐ Tick this box to confirm that the raw and calibrated dates are available in the paper or in Supplementary Information.

Animals and other organisms

Policy information about [studies involving animals](#); [ARRIVE guidelines](#) recommended for reporting animal research

Laboratory animals	<i>For laboratory animals, report species, strain, sex and age OR state that the study did not involve laboratory animals.</i>
Wild animals	<i>Provide details on animals observed in or captured in the field; report species, sex and age where possible. Describe how animals were caught and transported and what happened to captive animals after the study (if killed, explain why and describe method; if released, say where and when) OR state that the study did not involve wild animals.</i>
Field-collected samples	<i>For laboratory work with field-collected samples, describe all relevant parameters such as housing, maintenance, temperature, photoperiod and end-of-experiment protocol OR state that the study did not involve samples collected from the field.</i>
Ethics oversight	<i>Identify the organization(s) that approved or provided guidance on the study protocol, OR state that no ethical approval or guidance was required and explain why not.</i>

Note that full information on the approval of the study protocol must also be provided in the manuscript.

Human research participants

Policy information about [studies involving human research participants](#)

Population characteristics	<i>Describe the covariate-relevant population characteristics of the human research participants (e.g. age, gender, genotypic information, past and current diagnosis and treatment categories). If you filled out the behavioural & social sciences study design questions and have nothing to add here, write "See above."</i>
Recruitment	<i>Describe how participants were recruited. Outline any potential self-selection bias or other biases that may be present and how these are likely to impact results.</i>
Ethics oversight	<i>Identify the organization(s) that approved the study protocol.</i>

Note that full information on the approval of the study protocol must also be provided in the manuscript.

Clinical data

Policy information about [clinical studies](#)

All manuscripts should comply with the ICMJE [guidelines for publication of clinical research](#) and a completed [CONSORT checklist](#) must be included with all submissions.

Clinical trial registration	<i>Provide the trial registration number from ClinicalTrials.gov or an equivalent agency.</i>
Study protocol	<i>Note where the full trial protocol can be accessed OR if not available, explain why.</i>
Data collection	<i>Describe the settings and locales of data collection, noting the time periods of recruitment and data collection.</i>
Outcomes	<i>Describe how you pre-defined primary and secondary outcome measures and how you assessed these measures.</i>