TRIBE editing reveals specific mRNA targets of eIF4E-BP in Drosophila and in mammals

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4E-BP (eIF4E-BP) represses translation initiation by binding to the 5′ cap–binding protein eIF4E and inhibiting its activity. Although 4E-BP has been shown to be important in growth control, stress response, cancer, neuronal activity, and mammalian circadian rhythms, it is not understood how it preferentially represses a subset of mRNAs. We successfully used HyperTRIBE (targets of RNA binding proteins identified by editing) to identify in vivo 4E-BP mRNA targets in both Drosophila and mammals under conditions known to activate 4E-BP. The protein associates with specific mRNAs, and ribosome profiling data show that mTOR inhibition changes the translational efficiency of 4E-BP TRIBE targets more substantially compared to nontargets. In both systems, these targets have specific motifs and are enriched in translation-related pathways, which correlate well with the known activity of 4E-BP and suggest that it modulates the binding specificity of eIF4E and contributes to mTOR translational specificity.

INTRODUCTION
The signaling pathway downstream of the insulin receptor (InR) and the mammalian (or mechanistic) target of rapamycin kinase (mTOR) is well conserved in all eukaryotes and integrates different environmental signals to govern organismal growth. Under unfavorable circumstances such as nutrient-rich conditions, InR-mTOR signaling accelerates growth by increasing processes involved in anabolic metabolism and promoting growth in cell size and number (1). The same processes are inhibited in nutrient-restricted or stress conditions. A major process regulated by InR-mTOR signaling is translation. This is so that this high energy-consuming process can be increased under progrowth conditions or decreased under low-growth or no-growth conditions, e.g., under stress conditions.

4E-BP [eukaryotic initiation factor 4E (eIF4E)–binding protein] is a crucial regulator of this translational control pathway. There are three homologs (4E-BP1, 4E-BP2, and 4E-BP3) in mammals but only one in Drosophila melanogaster (Thor/d4E-BP), the product of the Thor gene. d4E-BP is crucial for life-span extension under oxidative stress and nutrient-restricted conditions [Zid et al. (2)], consistent with a prominent role in restricting growth. The impact of 4E-BP extends far beyond cellular stress management, e.g., it affects cancer, proper neuronal activity, and mammalian circadian entrainment (2–6).

4E-BP inhibits translation initiation by blocking the formation of the translation initiation complex eIF4F (1, 7, 8). eIF4F consists of the 5′ cap–binding protein eIF4E, the RNA helicase eIF4A, and the scaffolding protein eIF4G. Under favorable growth conditions, the mTOR signaling pathway phosphorylates 4E-BP, which prevents it from binding to eIF4E. Under less favorable or stress conditions, inactivation of mTOR signaling results in dephosphorylation and activation of 4E-BP. Because eIF4G and hypophosphorylated 4E-BP share the same binding site on eIF4E, active 4E-BP blocks the eIF4G-binding site on eIF4E and thereby inhibits eIF4F formation and translation (9).

To identify mRNAs regulated by 4E-BP, others have examined global mRNA translation using ribosome profiling under mTOR inhibition conditions (10, 11). The results showed that active 4E-BP preferentially represses translation of a subset of mRNAs. Although inhibition of eIF4F formation can explain how the general rate of cap-dependent translation is decreased, it does not explain how the translation of specific mRNAs is selectively inhibited, i.e., whether this is a direct or indirect effect of active 4E-BP.

In vitro assays have suggested that 4E-BP may indirectly associate with mRNA through the cap-binding protein eIF4F. There are several pieces of evidence supporting this hypothesis, including that 4E-BP can be copurified with eIF4F from cell extracts with an mRNA-cap analog pull-down assay and that 4E-BP enhances the in vitro interaction of eIF4E with a capped short RNA oligonucleotide (12, 13). However, these interactions do not address the specificity issue, and it is uncertain whether they are physiologically relevant. This is because there are few tools to detect the association of proteins like 4E-BP with specific mRNA within cells.

To address this deficiency, i.e., to identify the in vivo target transcripts of RNA binding proteins (RBPs) in Drosophila, we recently developed TRIBE (targets of RBPs identified by editing) (14). This technique characterizes fusion proteins between the catalytic domain of the Drosophila RNA editing enzyme ADAR (ADARcd) and RBPs of interest. An RBP-ADARcd fusion protein can bind to target transcripts of the RBP and edit adenosine nucleotides to inosines near the fusion protein binding site; these are read as guanosines by high-throughput sequencing and identified as A-to-G editing sites by computational analysis. Transcripts hosting these A-to-G editing sites are considered binding targets of the RBP. The upgraded version of TRIBE, HyperTRIBE, contains the one amino acid substitution E488Q in the ADARcd region (hyper-ADARcd), which improves target identification efficiency by reducing bias originating from the intrinsic editing preference of the ADARcd (15–17).

Here, we applied HyperTRIBE to both flies and mammals and characterized 4E-BP direct target transcripts within cells. These transcripts were enriched for mRNAs encoding translation factors, including the translation initiation factor eIF3. Translation factors
RESULTS

mTOR-dependent translational repression affects specific genes, suggesting that 4E-BP may associate with a subset of mRNAs and/or that some mRNAs selectively escape from 4E-BP-mediated repression (11, 18). The TRIBE method was developed in the Drosophila system and is ideal to address the possibility that d4E-BP associates with specific mRNAs. To perform Thor-TRIBE experiments in cultured Drosophila S2 cells, we constructed a plasmid in which the hyperactive Drosophila ADARcd (hyper-dADARcd) was fused to Drosophila 4E-BP (d4E-BP; fig. S1A). If d4E-BP associates with specific eIF4E–5′ capped mRNAs in cells, the hyper-dADARcd should deaminate nearby adenosines, leaving A-to-I editing marks on the associated mRNAs. A plasmid that only expresses the hyper-dADARcd was used as a negative control (16). We used Western blotting to confirm their similar expression (fig. S1B) and also that Thor–hyper-dADARcd could be efficiently dephosphorylated after mTOR inhibition (fig. S1C).

To address whether TRIBE can identify Thor-associated mRNA targets, mRNA libraries were generated from positively transfected cells and sequenced with the Illumina NextSeq 5000 System. To generate lists of editing sites and target genes, the sequencing data were then analyzed with our published TRIBE computational analysis pipeline [Rahman et al. (15)]. In wild-type S2 cells or S2 cells expressing hyper-dADARcd alone, very few editing events were detected. However, thousands of editing sites were detected after induction of Thor-TRIBE expression (Fig. 1A, Thor-Hyper). Because mTOR inhibition dephosphorylates 4E-BP and enhances its activity and its interaction with eIF4E (11), we reasoned that mTOR inhibition should increase the number of target mRNAs identified by Thor-TRIBE. More editing sites and target genes were detected after inhibiting mTOR activity with serum depletion and rapamycin. There were also more editing sites and genes after addition of the mTOR inhibitor Torin-1, indicating that editing may reflect Thor activity (Fig. 1A). Moreover, the biological repeats were reproducible (fig. S1D). The data taken together suggest that Thor-TRIBE reflects 4E-BP activity and that the fusion protein associates with a subset of specific mRNAs in cells (Fig. 1A).

We next performed metagene analysis to examine the distribution of editing sites. The distribution of sequencing reads from all exonic regions was used as background. The editing sites of Thor-TRIBE were relatively enriched in 5′ untranslated regions (5′UTRs) compared to this background, consistent with a preferred association of d4E-BP with the eIF4E–5′ cap complex (Fig. 1B). The target transcripts identified under these different conditions overlapped well, although many more were detected after mTOR inhibition (Fig. 1C). We carried out de novo motif searches from the 5′UTRs or 3′UTRs of the 968 Thor targets (table S1), which were reproducibly detected in Thor-HyperTRIBE after rapamycin or Torin-1 treatment. As a background control, we randomly selected 968 highly expressed genes, which were not identified as Thor targets.

The search for consensus sequences from the first 20 nucleotides (nt) of target 5′UTRs identified a GGUCACACUG motif (dMotif-1) and a pyrimidine-rich motif (dPRTE; Fig. 1D). A further motif search within the full 5′UTRs of targets identified a similar CGGUCACACU motif in 195 mRNAs (>20%) with an even more significant E value and site count than that from the first 20 nt; no significant motifs were found within the 3′UTRs (Fig. 1D).

The dPRTE resembles the 5′ terminal oligopyrimidine tract (5′TOP) and the pyrimidine-rich translational element (PRTE) identified as translational control elements in mammals (fig. S1E) (10, 19–21). These motifs are also enriched within the 5′UTRs of mTOR-responsive mammalian mRNAs (10, 11), consistent with the results shown here. Both the 5′TOP and the PRTE are stretches of uninterrupted pyrimidine nucleotides, but the 5′TOP starts with a cytosine residing from position +1 of the 5′UTR, and the PRTE is
defined as a pyrimidine-rich element within the 5′ UTR including an invariant uridine at position 6 of the motif. The activity of mammalian La-related protein (LARP) is also under mTOR regulation and is reported to bind to a similar 5′TOP or PRTE motif (see Discussion) (22, 23).

Furthermore, gene ontology (GO) term analysis indicates that these Thor targets are enriched in protein synthesis pathways, consistent with the notion that translation is a key process regulated directly by Thor (Fig. 1E). Toll signaling and ubiquitin-independent proteasomal proteins are also enriched, whereas negative regulators of transcription are depleted in the Thor targets. As the mTOR pathway has been shown to be an important mediator of immune responses (24, 25), these results implicate Thor in regulating the innate immune response via Toll signaling.

To verify that d4E-BP inhibits the translation of these mRNAs, protein synthesis was assayed in a number of different ways. We first used metabolic labeling by SUnSET (surface sensing of translation) to assay the effect of mTOR inhibition on general translation. This method uses puromycin incorporation into newly synthesized peptides to monitor the rate of general protein synthesis (26). Puromycin-attached peptides are detected by Western blotting using an anti-puromycin antibody. Cells were pulsed with puromycin, and we compared general protein synthesis after treating cells with several mTOR inhibitors: rapamycin, Torin-1, or Ink128. All three inhibitors reduced protein synthesis, with rapamycin being the most effective (Fig. 2A). We suspect that the effect of the mTOR inhibitors on general protein synthesis may be different in different cells. Translation inhibition by rapamycin is weaker than that by Torin-1 or Ink128 in mouse embryo fibroblasts (MEFs), but rapamycin and Ink128 inhibition are similar in mouse lymphocytes (11, 27).

To examine translational activity at the whole-transcriptome level, we carried out ribosome profiling with and without mTOR inhibition, i.e., 100 nM rapamycin or Torin-1 for 2 hours. The strategy of ribosome profiling in mammals and yeast is to obtain ribosome-protected fragments (RPFs) by digesting cell lysates with ribonuclease I (RNase I) (28, 29). However, Drosophila ribosomes are reported to be too sensitive to RNase I, so micrococcal nuclease (MNase) is commonly used for ribosome profiling in this species. Although this makes P-site mapping difficult because of the strong 3′ A/T bias of MNase, it is still useful for measuring translation rates (30).

Treating cell lysates with MNase confirmed that RPFs are enriched between 28 and 34 nt in size (Fig. S2A). We then purified these RPFs, made sequencing libraries using the adaptor ligation-based method, and sequenced them. Input mRNAs were purified from cell lysates without MNase treatment and fragmented to make sequencing libraries following similar protocols to those for RPFs. The length of sequencing reads peaked at ~32 nt from RPFs and ~42 nt from input mRNAs (Fig. S2B). The measurements of input and RPF from both replicates correlated well (Fig. S2C). Consistent with the results of the metabolic labeling (Fig. 2A), more translationally repressed genes were detected after treating with rapamycin than that with Torin-1, i.e., 674 mRNAs decreased in translational efficiency (TE) after rapamycin treatment and 495 mRNAs decreased in TE after Torin-1 treatment (Fig. 2B and table S2).

To orthogonally validate the Thor-TRIBE target data, we compared these genes with those that manifest decreased TEs in response to rapamycin or Torin-1 treatment. One hundred forty-four of these transcripts were also identified by Thor-TRIBE, suggesting that they are direct targets of d4E-BP (40 + 49 + 55; Fig. 2B). They encode ribosomal proteins (RPs), translational initiation factors, and other translation-related proteins (Fig. 2 C). These transcripts are highly enriched for subunits of the elf3 complex. Of the 13 expressed subunits of elf3, 10 fall in this overlapping category, namely, elf3b, elf3d1, elf3e, elf3g1, elf3h, elf3i, elf3j, elf3k, elf3l, and elf3m (table S3). The TE of these 10 genes decreased after mTOR inhibition (Fig. 2D).

We next asked whether the motifs enriched in Thor-TRIBE targets appear in the translational repression assays. We compared the mean TE change after mTOR inhibitor treatment among different groups of transcripts expressed in S2 cells, including non–Thor-TRIBE targets, all Thor-TRIBE targets, Thor-TRIBE targets with dMotif-1, or Thor-TRIBE targets with dPRTE (Fig. 3A).

Thor-TRIBE targets containing the dPRTE/TOP motif showed marked translational repression in response to mTOR inhibition. This is consistent with previous reports that regulation of TOP mRNA translation by mTORC1 is 4E-BP dependent (10, 11, 31). Although much less marked, the mean TE changes of all Thor-TRIBE targets and of targets with dMotif-1 were also significantly different from that of nontargets. Cumulative frequency distributions
of TE changes of targets with a dPRTE motif also had a marked distribution difference compared to nontargets, and all Thor-TRIBE targets or targets with dMotif-1 showed a much weaker but still significant difference from nontargets, especially when Torin-1 was used as the mTOR inhibitor (Fig. 3, B and C). These ribosome profiling data are notable because most dPRTE-containing Thor-TRIBE targets had substantially decreased TE after treatment with the mTOR inhibitors compared to the dimethyl sulfoxide (DMSO) control (Fig. 3D). Although the 5′TOP and the PRTE cis-regulatory motifs are well known in mammals and predicted to be translation elements in Drosophila (fig. S1E) (21), our results confirm that they play a conserved role in flies (Fig. 3D).

We then used CLIP (crosslinking immunoprecipitation) to address RNA recognition and determine whether d4E-BP is in physical contact with RNA. The RBP and its ultraviolet (UV)—cross-linked RNAs in the cell lysate were partially digested with RNase A. After immunoprecipitating d4E-BP with a V5 antibody, cross-linked RNAs in the RBP were labeled with [γ-32P]adenosine triphosphate ([γ-32P]ATP) at their 5′ ends and detected on denaturing polyacrylamide gels (Fig. 4A). A parallel control experiment was carried out with untransfected S2 cells and an antibody directed against the Drosophila heterogeneous nuclear RNP (HnRNP) protein Hrp48. Although the Thor-TRIBE signal was not as strong as a typical RBP like Hrp48, radioactive signals were reproducibly detected by phosphomager at 5 to 10 kDa above the expected protein size, indicating that d4E-BP is in close proximity to RNA and may contribute to RNA binding activity like Hrp48 (Fig. 4B). Transcript specificity of the CLIP tags was well compared to the TRIBE data, suggesting that Thor interacts broadly and transiently with mRNA and that TRIBE may be more successful at pointing to a biologically meaningful subset of transcripts (see Discussion).

Last, we examined whether 4E-BP also associates with target mRNAs in mammalian cells. As mentioned above, there are three 4E-BP proteins in mammals, namely, 4E-BP1, 4E-BP2, and 4E-BP3. They have somewhat different expression patterns in adult mouse tissues, and we chose 4E-BP1 (human or h4E-BP1) for HyperTRIBE experiments because it is the most broadly expressed (32). To carry out h4E-BP1-HyperTRIBE in human cells, we first tried the hyper-active Drosophila ADARcd previously used for HyperTRIBE editing (16). However, few editing events were detected when Drosophila hyper-ADARcd was fused to h4E-BP1 and HyperTRIBE carried out in human prostate cancer PC3 cells. We therefore substituted the hyper-dADARcd with the catalytic domain of human ADAR2 containing the E488Q point mutation at the corresponding position (hyper-hADAR2cd).

The results showed that h4E-BP1-HyperTRIBE but not the hyper-hADAR2cd alone successfully identified h4E-BP1 targets in PC3 cells. mTOR inhibition with Ink128/PP242 increased h4E-BP1-HyperTRIBE editing compared to the DMSO control (Fig. 5A), similar to the Drosophila results shown above (Fig. 1A). Also similar to those results, these human cell data indicate that 4E-BP inhibits translation by associating with its target mRNAs.

Transcripts of VIM (vimentin), ODC1 (ornithine decarboxylase), and CCND3 (cyclin D3) were previously identified as 4E-BP targets

![Fig. 3. Ribosome profiling data show that the TE change of Thor-TRIBE target after mTOR inhibition has a down-regulation compared with non–Thor-TRIBE target.](image-url)
Hrp48, was used as a positive control. S2 or Thor-V5 cells were UV–cross-linked (UV+) CLIP of Thor-V5 shows that Thor has an RNA binding activity. A well-known RBP, (36), was reported to be enriched in eIF4E-sensitive mRNAs, i.e., the translation of these transcripts was sensitive to eIF4E expression levels (34).

De novo motif searches from the UTRs of TRIBE targets identified the PRTE as well as cytosine-enriched regulator of translation (CERT) within the entire 5′UTR. The CERT motif was previously reported to be enriched in eIF4E-sensitive mRNAs, i.e., the translation of these transcripts was sensitive to eIF4E expression levels (34).

These PC3 cell experiments identified 711 h4E-BP1 target genes (table S4), and their functions were enriched in translation processes and the immune response like in fly cells (Fig. 5E). Comparing these 711 h4E-BP1 targets in human cells with the 968 d4E-BP targets in fly cells identified 180 sets of targeted homologs. As 225 human genes have 228 orthologs in flies, at least 32% of the 4E-BP human targets are conserved in flies (Fig. 5F and table S5). These data point to conserved 4E-BP activity. Yet, it is known that translation component–encoding mRNAs should be the most strongly affected by 4E-BP and eIF4G compete for the same region of eIF4E. However, the sequestration of eIF4E by activated 4E-BP reduces the level of translation initiation complex elf3F (34, 38). This results in the translational repression of mRNAs that are more sensitive to elf4F levels (fig. S3, model 1). This makes sense in light of the fact that 4E-BP and elf4F compete for the same region of elf4E. However, this sequestration model is paradoxical as it suggests that the weakest elf4E-binding mRNAs should be the most strongly affected by 4E-BP activity. Yet, it is known that translation component–encoding transcripts like RP mRNAs are efficiently translated, suggesting that the weakest elf4E-binding mRNAs are those encoding RPs; ribosomes are major growth effectors. In addition, 4E-BP represses the translation of most subunits of the translation initiation factor elf3, although to a lesser extent than RPs. Several elf3 subunits have been shown to exhibit features of TOP mRNAs (36). The function of these elf3 targets is somewhat less straightforward to interpret, but one possibility is that these interactions also serve to inhibit growth: Reducing elf3 protein levels would inhibit the translation of elf3-dependent transcripts, which not only affects the canonical elf4E-cap–dependent translation but also inhibits the elf4E-independent cap–dependent translation (37).

There is only modest overlap between the many Thor-TRIBE targets and mRNAs with decreased TE after rapamycin or Torin-1 treatment (Fig. 2B). It is possible that a significant fraction of mRNAs with decreased TE is due to secondary effects of mTOR inhibition, e.g., direct inhibition of a positive translation factor, which would account for the poor representation of many Thor-TRIBE targets. There is also only a modest overlap between the effects of rapamycin and Torin-1 on TE (Fig. 2B). This might reflect different quantitative as well as qualitative effects of the two drugs and be related to the fact that rapamycin had a stronger overall translational inhibitory effect in S2 cells, for unknown reasons (Fig. 2A). This is despite the fact that Torin-1 is considered the more comprehensive mTOR inhibitor and had a stronger inhibitory effect on Thor-TRIBE targets (Figs. 2 and 3).

There are, to our knowledge, no previous data describing in vivo 4E-BP target transcripts. Otherwise put and despite previous results indicating that a subset of mRNAs is preferentially affected by mTOR and suggesting that 4E-BP is its principle downstream translational effector (10, 11), it was unclear how mRNA specificity is determined. It had been proposed that expression of elf4E is rate-limiting under some conditions such as tumorigenesis and that the sequestration of elf4E by activated 4E-BP reduces the level of the translation initiation complex elf3F (34, 38). This results in the translational repression of mRNAs that are more sensitive to elf4F levels (fig. S3, model 1). This makes sense in light of the fact that 4E-BP and elf4F compete for the same region of elf4E. However, this sequestration model is paradoxical as it suggests that the weakest elf4E-binding mRNAs should be the most strongly affected by 4E-BP activity. Yet, it is known that translation component–encoding transcripts like RP mRNAs are efficiently translated, suggesting that the targets of 4E-BP are normally efficient binders of the canonical translational initiation complex.

This problem has been somewhat ameliorated by the recent identification of LARP1 as a second translational effector, which has been shown to bind directly to the 5′TOP and/or PRTE sequence elements as well as to the 5′ cap (22, 23). It is possible that the specificity for 5′TOP and/or PRTE elements comes, in part, from the specificity of dephosphorylated LARP1 for these elements (fig. S3, model 2). In this context, the much stronger repression of Thor targets with dPRTE than with dMotif-1 (Fig. 3) is consistent with a functional collaboration of LARP1 and Thor to repress the expression of dPRTE-containing transcripts. We note that the impact of 4E-BP on translation is likely to be more complicated as it may depend on elf4E expression levels relative to those of 4E-BP...
as well as the status of the multiple phosphorylation sites of 4E-BP. There are also three orthologs of mammalian 4E-BP (1/2/3) with tissue-specific expression.

Moreover, LARP1 and 4E-BP have distinct mRNA targets except for PRTE mRNAs. It is also notable that Thor-TRIBE targets containing the dPRTE motif and those containing the CGGUCA-CACU motif (dMotif-1) rarely overlap; they therefore probably reflect different groups of regulated targets. This also suggests that Thor collaborates with different RBPs that affect and may even determine mRNA recognition (fig. S3, model 2). It is even possible in this context that Thor has no RNA recognition activity, which appears to conflict with the positive CLIP result (Fig. 4).

A positive CLIP signal may occur despite a very low intrinsic affinity of a protein for RNA. For example, 95% of the binding energy between eIF4E-4BP and RNA could originate from a protein-protein interaction, perhaps an interaction with eIF4E and/or with another RBP, and only 5% from a direct eIF4E-4BP-RNA interaction. A similar logic may apply to many of the large number of RBPs revealed by in vivo cross-linking procedures, i.e., perhaps only a minority of them are RBPs capable of binding to RNA in vitro as single recombinant proteins.

It may be relevant in this context that a comparable role of Drosophila LARPI to that of mammalian LARPI in growth control has not been established. There is considerable divergence between the fly and the mammalian protein, and Drosophila LARPI is known to have other functions (39). These considerations indicate that even recognition of the dPRTE motif by Drosophila LARPI is currently uncertain.

Although 4E-BP-mediated editing is enriched in the 5′UTR, editing occurs elsewhere within the transcript, in fly cells as well as in mammalian cells. This could reflect 4E-BP overexpression, which might also help explain the large number of Thor-TRIBE targets without a strong TE effect from rapamycin or Torin-1 addition (Fig. 2B). However, it is likely that editing outside of the 5′UTR is also because the ADARcd can access and edit a susceptible sequence (Fig. 2B). However, it is likely that editing outside of the 5′UTR is also because the ADARcd can access and edit a susceptible sequence element a considerable distance away from the binding site of its corresponding protein complex (16). This 5′UTR enrichment may reflect associations between the 5′ and 3′ ends of translating mRNAs during 4E-BP–dependent translational inhibition, based, for example, on known protein-protein interactions between 5′ end and 3′ end translation components. This “reach” interpretation is supported by the fact that the Thor-TRIBE target genes have no significantly enriched 5′UTR motif. Moreover, no 5′UTR enrichment was observed in previous TRIBE editing experiments with other RBPs (14, 16). These considerations indicate that the editing data reflect the true binding specificity of Thor rather than any technical bias.
In summary, TRIBE works well for eIF4E-BP, in mammalian cells and in Drosophila cells. Recent results from elsewhere on different RBPs show that TRIBE also works well in other mammalian systems (40–42). Moreover, our current results suggest that TRIBE demonstrates more target transcript specificity than CLIP. Although work in this paper does not constitute a proper head-to-head comparison of TRIBE and CLIP, this suggestion is similar to conclusions from other TRIBE versus CLIP comparisons in mammalian cells (41). Because ADAR deamination is slow (17), TRIBE editing may reflect targets with longer RBP dwell time and therefore tighter binding whereas cross-linking may be better able to capture ephemeral associations between a RBP and RNA. At a minimum, this progress indicates that TRIBE will add to the arsenal of techniques available to identify and study the mRNA targets of diverse RBPs in many different cells and systems.

MATERIALS AND METHODS

TRIBE in S2 cells

The region including the 5′UTR and CDS (protein coding sequence) of Thor was cloned into pMT-Linker-ADAR-cd-E488Q-V5 plasmid (100–amino acid flexible linker) to make pMT-Thor-Linker-HyperTRIBE construct using Gibson Assembly (New England Biolabs) (16). pMT HyperTRIBE plasmid (400 ng) and pAct5.1-eGFP (400 ng) (enhanced green fluorescent protein) were cotransfected into Drosophila S2 cells using Cellfectin II from Thermo Fisher Scientific. Twenty-four hours after transfection, TRIBE protein expression was induced with copper sulfate. Another 24 hours later, cells were treated with 50 nM rapamycin (Fisher Scientific) plus serum depletion, 50 nM rapamycin, 50 nM Torin-1 (Fisher Scientific), or vehicle DMSO for 5 hours. More than 10,000 GFP-positive cells were sorted and collected with a BD FACSAria II machine. Total RNA was extracted from the sorted cells with TRIzol LS reagent. Expression of proteins was assayed by SDS-PAGE, staining with anti-4EBP1 (Thr 37/46; Cell Signaling Technology, # 2855), and β-actin (Santa Cruz Biotechnology, sc-47778).

Ribosome profiling in S2 cells

Lysate preparation

The preparation of lysate and RPFs for ribosome profiling was performed according to the protocol described in (30). Eighteen million S2 cells were plated to 10-cm dishes in 12 ml of cell culture medium [HyClone SFX-Insect cell culture medium with 10% heat-inactivated FBS (Thermo Fisher Scientific)] 1 day before the experiment. Cells were treated with 100 nM rapamycin, Torin-1, or vehicle DMSO for 2 hours (six dishes of cells for each drug). After treating cells with emetine (20 μg/ml) (Sigma-Aldrich, St. Louis, MO) for 2 min, cells were washed twice with ice-cold phosphate-buffered saline supplemented with emetine [20 μg/ml] and four to six cell volumes (200 μl/10-cm dish) of cold polysome lysis buffer [50 mM tris buffer (pH 7.5), 150 mM NaCl, 5 mM MgCl2, 0.5% Triton X-100, 1 mM dithiothreitol (DTT), SUPERase•In RNase Inhibitor (20 U/ml; Ambion), and emetine (20 μg/ml)] were collected. Cells were then homogenized on ice in a prechilled Dounce homogenizer (seven times with A pestle and seven times with B pestle). The lysate was clarified by spinning 10 min at 20,000g at 4°C. The supernatant was separated to three sets for generating RNA (input) and RPF sequencing libraries. Then, 750 μl of TRIzol LS (Thermo Fisher Scientific) was added to 250 μl of lysate, and total RNA (input RNA) purification was performed according to the manufacturer’s instructions. Other sets were flash-frozen in liquid nitrogen and stored at −80°C for RPF preparation. When ready to proceed, frozen samples were thawed on ice in the cold room.

RPF preparation

For each sample, lysate was diluted 2:1 in digestion mixture [50 mM tris (pH 7.5), 5 mM MgCl2, 0.5% Triton X-100, 1 mM DTT, SUPERase•In (20 U/ml), emetine (20 μg/ml), 15 mM CaCl2, and MNase (150 U per dish; Roche Applied Science)]. Samples were digested for 40 min at 25°C in a thermomixer (Eppendorf, Hamburg, Germany). Digestions were stopped by adding EGTA to a final concentration of 6.25 mM and placing the reactions on ice. For purification of monosomes, Sephacryl S-400 columns (GE Healthcare) were used. Columns were vortexed to mix resin well (avoid bubbles), and the storage buffer on resin was removed by gravity flow. Columns
were equilibrated by repeating five times the step of loading 600 μl of polysome buffer and removing it by gravity flow. The columns were spun down at 600g for 4 min. Sample (250 μl) was loaded to the column and spun down at 600g for 2 min to collect the solution flown through into a new tube. The RNA was then purified from the solution using TRIzol LS.

**rRNA depletion**

Ten micrograms of input RNAs and 2.5 μg of RPF RNAs were treated with Ribo-Zero reaction (MRZH11124C, Epicentre) kit by following the manufacturer’s instructions. For ribosomal RNA (rRNA) depletion from RPF RNAs, the 50°C incubation in the manufacturer’s instructions was omitted.

The collected 100 μl of supernatant from Ribo-Zero reaction is precipitated by adding 500 μl of 100% ethanol, 10 μl of 3 M NaOAc, and 1 μl of glycoBlue (Invitrogen). The RNA was resuspended in 10 μl of nuclease-free water.

**Sequencing library preparation**

Input RNA was fragmented by partial alkaline hydrolysis. Input RNA (10 μl) was mixed with 10 μl of 2x fragmentation buffer [2 mM EDTA, 12 mM Na₂CO₃, 88 mM NaHCO₃, (pH ~9.3)] and incubated at 95°C for 18 to 20 min. Then, input RNA and RPF were resolved on a 15% tris-borate EDTA (TBE)–urea gel (Invitrogen). A gel slab corresponding to 34 to 55 nt for input and 28 to 34 nt for RPF was excised from the gel, eluted, and precipitated. 3’ phosphoryl groups were removed from RNA using T4 polynucleotide kinase (New England Biolabs) by incubating at 25°C for 6 hours and 22°C for 6 hours. 5’ End of RNA was phosphorylated and labeled by [γ-³²P]ATP using T4 polynucleotide kinase (New England Biolabs) at 37°C for 45 min. 3’ Adaptor–ligated RNA was resolved on a 15% TBE–urea gel (Invitrogen), and the RNA in the size of 54 to 75 nt for input and 48 to 54 nt for RPF was purified. 5’ Adaptor (TruSeq small RNA kit, RA5, preadenylated) was ligated to the RNA using T4 RNA ligase 2 truncated (New England Biolabs) by incubating at 25°C for 6 hours and 22°C for 6 hours. Reverse transcription was carried out using RT primer (TruSeq small RNA kit, RTP) and SuperScript III RT enzyme (Invitrogen). Library was amplified by 10 to 14 cycles of PCR using indexing primers (TruSeq small RNA kit) and Phusion polymerase (Thermo Fisher Scientific). Amplification product was size-selected on 6% TBE gels (Invitrogen). Samples were then quantitated using the Bioanalyzer High-Sensitivity DNA Assay (Agilent Technologies) and single-end–sequenced in Illumina NextSeq 500 sequencing system using NextSeq High Output Kit v2 (75 cycles).

**Sequence processing and alignment of ribosome profiling**

The alignment of sequencing reads was performed according to steps 90 to 96 of (45). Briefly, the raw reads were filtered and preprocessed according to quality scores (fastq_filter), the exact sequence duplicates were collapsed (fasta2collapse), 3’ adaptor sequence was trimmed (fastx_clipper), and degenerate bar-code sequences were removed (stripBarcode). The reads were aligned to the reference genome dm3 (novoalign -t 85 -l 23 -s 1 -r None) with at least 23 high-quality matches and with alignment cost score “−t 85.” Then, the potential PCR duplicates by coordinates were collapsed and unique reads were identified.

- mRNA abundance (input RNA) and ribosome density (RPF) for each genomic feature were measured in FPKM (fragments per kilobase of feature length per million mapped reads) aligning to genomes. mRNA abundance reflects the total number of RNA fragments aligning to all countable exonic positions for a given gene. Ribosome density refers to all RPF fragments that align to countable positions of a coding region (CDS) for a given gene. We calculate TE as the ratio of footprint (RPF) FPKM in the CDS to the RNA fragment (input RNA) FPKM across the exons. FPKM more than 2 was used for further analysis.

**Motif analysis and GO**

We performed motif analysis using MEME version 4.11.2 (parameters: -minw 6 -maxw 10 -maxsize 100000000 -dna -nmotifs 5 -maxsites 200) (46). As the background control of the motif analysis, a similar number of transcripts were randomly selected from highly expressed genes that are not TRIBE targets. GO analyses were performed using PANTHER (47). TRIBE target genes were analyzed against a background of all genes expressed in the S2 cells or PC3 cells (>2 FPKM). Gene expression levels were quantified using Cufflinks2.

**SUPPLEMENTARY MATERIALS**

Supplementary material for this article is available at http://advances.sciencemag.org/cgi/content/full/6/33/eabb8771/DC1 View/request a protocol for this paper from Bio-protocol.

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