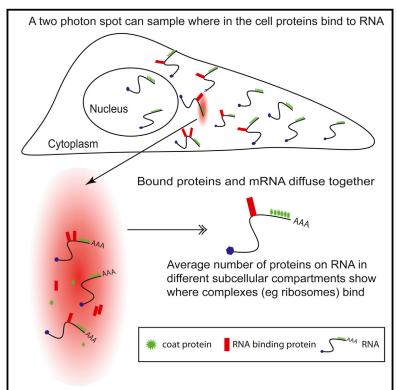


# **Quantifying Protein-mRNA Interactions in Single Live Cells**

## **Graphical Abstract**



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#### In Brief

Two-photon detection of single RNAs binding to individual proteins in live cells enables quantitative analysis of binding events in different cellular compartments, unveiling a mechanism for translational control in neurons.

## **Highlights**

- Two-photon detection of single RNAs binding to individual proteins in live cells
- Quantitative measurement of protein number bound to mRNAs in cellular compartments
- Spatiotemporal quantification of mRNA association with ZBP1 and ribosomes
- ZBP1 represses ribosome binding to β-actin mRNA perinuclearly, but not peripherally



# Resource

# Quantifying Protein-mRNA Interactions in Single Live Cells

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http://dx.doi.org/10.1016/j.cell.2015.05.054

#### **SUMMARY**

Specific binding proteins are crucial for the correct spatiotemporal expression of mRNA. To understand this process, a method is required to characterize RNA-protein interactions in single living cells with subcellular resolution. We combined endogenous single RNA and protein detection with two-photon fluorescence fluctuation analysis to measure the average number of proteins bound to mRNA at specific locations within live cells. We applied this to quantify the known binding of zipcode binding protein 1 (ZBP1) and ribosomes to β-actin mRNA within subcellular compartments of primary fibroblasts and neurons. ZBP1-mRNA binding did not occur in nuclei, contrary to previous conclusions. ZBP1 interaction with β-actin mRNA was enhanced perinuclearly in neurons compared to fibroblasts. Cytoplasmic ZBP1 and ribosome binding to the mRNA were anti-correlated depending on their location in the cell. These measurements support a mechanism whereby ZBP1 inhibits translation of localizing mRNA until its release from the mRNA peripherally, allowing ribosome binding.

#### **INTRODUCTION**

Proteins play an essential role in the metabolism of RNA. The dynamic changes in the composition of protein-mRNA complexes are critical for mRNA regulation (Buxbaum et al., 2015; Hutten et al., 2014). However, methods to investigate RNA-protein interactions using traditional biochemical or genetic approaches suffer from false positive results because many proteins nonspecifically bind mRNA and form aggregates once removed from the cellular environment. False negatives may result from some protein-mRNA complexes not surviving cell lysis. Furthermore, ensemble biochemical measurements lack the spatiotemporal information of the interaction. Colocalization of images obtained by fluorescence in situ hybridization and immunofluorescence has been used to infer the interactions between mRNA and protein. However, colocalization is a poor indicator of physical interaction due to the inherent lim-

itations of optical resolution. Fluorescence resonance energy transfer (FRET) has been extensively used to measure protein-protein interactions, but it is limited to fluorescent molecules that are in close contact (<10 nm). Single molecule techniques such as fluorescence correlation spectroscopy (FCS), fluorescence cross-correlation spectroscopy (FCCS), and the corresponding image correlation spectroscopy (ICS) overcome these limitations (Digman et al., 2005; Kim et al., 2005; Petersen et al., 1993; Sankaran et al., 2009; Schwille et al., 1997). These methodologies are widely used to detect protein mobility and protein-protein interactions, yet their potential to study intracellular protein-RNA interactions quantitatively remains unexplored. Fluorescence fluctuation spectroscopy (FFS) (Chen et al., 2003; Digman and Gratton, 2011), a technique closely related to FCS, provides an alternative measure of molecular interactions via brightness analysis. Brightness characterizes the average fluorescence intensity of a single particle and encodes the stoichiometry of a molecular complex. For instance, if two fluorescently labeled monomers form a homo-dimer, the brightness doubles. Single-color brightness analysis utilizes this effect to study protein homo-interactions directly in cellular data (Chen et al., 2003). Number and brightness (N&B) analysis have generalized the brightness to the imaging modality and promise a spatial resolution of molecular interactions (Ross et al., 2011). Two molecular species labeled with spectrally separated fluorescent probes can be resolved with dual-color FFS brightness analysis (Chen et al., 2005). Recently, we have developed a method called heterospecies partition analysis (HSP) to extract the binding curves and stoichiometry for protein hetero-interactions (Li et al., 2012; Wu et al., 2010). However, a general technique to study protein-mRNA interaction using FFS is still not available. In this work, we apply dual-color brightness and heterospecies partition analysis to study protein-mRNA interactions directly in living cells.

Localization of mRNA to specific subcellular compartments allows spatial regulation of gene expression that is required for polarized cell morphology and motility. It has been previously established that  $\beta$ -actin mRNA localizes to the leading edge of primary fibroblasts (Lawrence and Singer, 1986) and the growth cone of the axon (Zhang et al., 1999). A *cis*-acting element, termed the zipcode, in the 3' UTR is necessary and sufficient for the localization phenotype (Kislauskis et al., 1994). Zipcode binding protein 1 (ZBP1/IMP1/IGF2BP1) is the transacting protein that binds to the zipcode and is necessary for  $\beta$ -actin



mRNA localization (Ross et al., 1997). ZBP1 has a number of conserved homologs in different species, collectively known as the VICKZ RNA binding protein family (Deshler et al., 1998; Kislauskis et al., 1994; Nielsen et al., 1999; Noubissi et al., 2006; Yisraeli, 2005). The VICKZ proteins share a characteristic arrangement of three canonical RNA binding didomains with two RNA recognition motifs (RRM) followed by two hnRNP-K homology (KH) didomains (Ross et al., 1997). Biochemical analysis has shown that the KH3 and KH4 didomain of ZBP1 binds to the zipcode with the same affinity as the full-length protein. Mutation of the linker region between the KH3 and KH4 disrupts the binding of KH34 to the zipcode (Chao et al., 2010). So far, the interaction between ZBP1 and β-actin mRNA has been shown in biochemical analyses with fragments of mRNA or proteins in vitro (Chao et al., 2010). The spatiotemporal distribution of this interaction in living cells has never been investigated.

To observe mRNA, we use the MS2 technology (Bertrand et al., 1998). In this method, genetically encoded MS2 binding sites (MBS) from bacteriophage are inserted into the gene of interest. Co-expression of the MS2 coat protein (MCP) fused to a fluorescent protein (FP) labels the target mRNA. Recently, we applied single color FFS to quantitatively study MCP binding on MBS. We developed a tandem dimer of MCP (tdMCP) that greatly increased the uniformity of the MS2 labeling (Wu et al., 2012). Due to significant brightness differences, the mRNA and free tdMCP could be readily resolved by FFS. This is crucial for applying HSP to study protein-mRNA interactions. With the recent advent of the β-actin-MS2 knockin mouse (MBS mouse) where all β-actin mRNAs have MS2 stem loops in the 3'UTR, we now have the ability to visualize and track endogenous mRNAs in real-time (Lionnet et al., 2011). Crossing the MBS mouse with a ZBP1 KO mouse (Katz et al., 2012) has enabled us to generate a cell line lacking ZBP1 expression. When mCherry-labeled ZBP1 is reintroduced into the cells and expressed at endogenous levels, we are able to probe the interaction of endogenous mRNA and protein. We use the HSP analysis to study the interaction between ZBP1 and  $\beta$ -actin mRNA in different cellular compartments in both mouse embryonic fibroblasts (MEF) and hippocampal neurons.

Controlling mRNA localization through RNA binding protein (RBP) mediated translational repression regulates protein expression spatially. For β-actin mRNA, ZBP1 binds to the β-actin mRNA and is proposed to repress its translation until it reaches the leading edge of the fibroblast where Src phosphorylates the Tyr<sub>396</sub> residue of ZBP1 (Hüttelmaier et al., 2005) and releases the mRNA from repression. In order to verify this in fibroblasts and extend this model to neurons, we correlated the association of the β-actin mRNA with ZBP1 or ribosomes in the cellular compartments where the mRNA is predicted to be either repressed or translated. To investigate translation, current technologies have been developed to visualize newly synthesized proteins (David et al., 2012; Dieterich et al., 2010) or ribosome occupancy (Ingolia et al., 2009; Jan et al., 2014). However, a method does not exist to image translation of specific mRNA with precise subcellular resolution. The FFS technique is ideal for this purpose since mRNA-protein interactions can be determined within sub-femtoliter observation volume. We labeled ribosomes by fluorescently tagging the ribosomal protein rpL10A with mCherry. We applied HSP analysis to directly measure the association between labeled ribosomes and  $\beta\text{-}actin$  mRNAs as a proxy to assess their translation in different cellular compartments. This approach revealed that the association of ribosomes and ZBP1 with the mRNA were anti-correlated both near the nucleus of primary fibroblasts and neurons and in peripheral cellular regions such as the leading edge of fibroblasts, therefore validating the hypothesis that ZBP1 spatially regulates  $\beta\text{-}actin$  mRNA localized translation.

#### **RESULTS**

# Heterospecies Partition Analysis for Protein-mRNA Interaction

The theory behind this approach is described in the Experimental Procedures. In brief, an mRNA species (M), in this case β-actin mRNA labeled by tdMCP-EGFPs binding to 24xMBS inserted in the 3' UTR, and an RNA binding protein (P), for instance mCherry-ZBP1, are expressed in the same cell (Figure 1A). The mixture is partitioned into three classes of pseudo-species (Figure 1B), the unbound MS2 coat protein; the heterospecies H, comprising all mRNA species associated with different numbers of RBP; and the free species F, containing RBP and its oligomers. We assume that the mRNA M is a singlet, that is, each mRNA particle contains only one mRNA molecule, which is supported by fluorescence in situ hybridization (Femino et al., 1998) and single color FFS measurements (Wu et al., 2012). Intuitively, the heterospecies can be differentiated from free unbound tdMCP-FP with single color brightness since mRNA is much brighter than single tdMCP-EGFPs in the green channel and from free species with dual-color brightness analysis since free species does not have green color (Figures 1B and S1A). The red channel heterospecies brightness depends on the degree of binding between M and P (Figures S1B-S1E). The exact FFS parameters of the hetero-species H are derived mathematically in the Supplemental Experimental Procedures.

#### **Validation of HSP Analysis**

To calibrate the FFS system for quantifying the number of RBPs bound to a single mRNA, we designed mRNAs containing two types of well-characterized protein binding sites. PP7 bacteriophage coat protein (PCP) binds to its own unique stem-loop: PP7 binding site (PBS), similar to the MCP and MBS association. The interaction between PCP and PBS has been extensively described both in vitro and in vivo (Chao et al., 2008; Wu et al., 2012). Here, we use PCP (tdPCP) as a model RBP and PBS as the target sites. Plasmids coding for CFP with 24xMBS inserted in the 3' UTR to label the mRNA were generated. Between the stop codon and the MBS, variable numbers of PBS were inserted, down to a single stem-loop to mimic the binding of a single protein to a single site (Supplemental Experimental Procedures). The plasmid was transfected together with both tdMCP-EGFP and tdPCP-mCherry in U2OS cells. Two avalanche photodiodes (APD) detect fluorescence signals from the sub-femtoliter two-photon focal volume that could be positioned accurately within the cell. The experiment was done at the two-photon laser wavelength 1,010 nm so that CFP was not excited. An example of an experimental

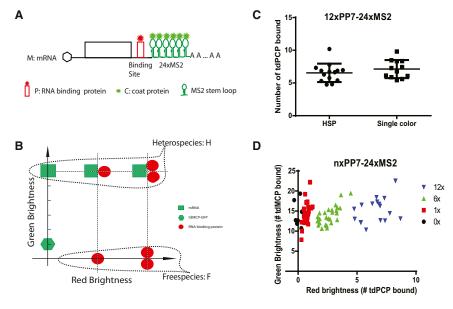


Figure 1. The Concept and Validation of HSP

(A) A schematic representation of an mRNA M with binding sites for a RNA binding protein P. The mRNA has 24xMS2 inserted in the 3' UTR and was labeled by fluorescent MS2 coat proteins.

(B) The brightness of various species in a hypothetical interaction  $M + 2P \leftrightarrow MP_2$ . For simplicity, we assumed that there was no spectral crosstalk. All species containing mRNA were partitioned into the heterospecies H. The free species F included all RBP and its oligomers. The free tdMCP-EGFP was the third species.

(C) The plasmids CFP-12xPBS-24xMBS. NLStdMCP-EGFP, and NLS-tdPCP-mCherry were transfected into U2OS cells. The Ti-sapphire laser was tuned to 1,010 nm to avoid exciting CFP. The transfected cells were measured for 3 min at the perinuclear region. The data were fit with the threespecies HSP model. The normalized red channel brightness represented the number of tdPCPmCherry bound to the mRNA. To cross-validate the result, we transfected U2OS cells with CFP-12xPBS-24xMBS and NLS-tdPCP-EGFP and

performed single color FFS measurements. The mRNA brightness normalized by EGFP brightness directly measured the number of NLS-tdPCP-EGFP on mRNA. The single-color and dual-color results were consistent with each other. Error bar, SD.

(D) The same experiments were performed for mRNA constructs CFP-nxPBS-24xMBS (n = 0,1,6,12) as in (C). The green channel brightness measures the number of tdMCP-EGFP on RNA. Note the green channel brightness of all mRNAs was from 24xMBS and hence equal. The red channel measured the variable number of NLS-tdPCP-mCherry bound to mRNA. The more PBS in the mRNA, the more tdPCP bound to each mRNA. In both (C) and (D), each data point represents a single cell.

See also Figure S1.

fluorescence intensity trace of 12xPBS (red)-24xMBS (green) was plotted in Figure S1F. From the fluorescence photon counts, we calculated the bivariate fluorescence cumulants of different binning times (Wu et al., 2006; Wu and Müller, 2005). We fit the dual-color time-integrated fluorescence cumulant with the three-species HSP model. An example fit is plotted in Figures S1G-S1J. From the fit, the brightness of the heterospecies was extracted. Normalized red channel brightness was used to directly measure the number of tdPCP-mCherry bound to mRNA (Figure 1C). This measurement revealed that the average tdPCP bound to an mRNA was approximately half the expected full occupancy. To confirm this, we performed a single color experiment using only tdPCP-EGFP instead of both tdPCP-mCherry and tdMCP-EGFP. Single channel brightness of mRNA was compared to the brightness of the EGFP monomer, which gave an independent measurement of the number of tdPCP bound to mRNA (Wu et al., 2012). The single color and dual-color experiment provided the same number of proteins bound (Figure 1C).

To test our ability to measure the stoichiometry of the proteinmRNA interactions, we varied the number of PBS in the 3'UTR of the reporter mRNAs. Green channel (MCP) brightness is constant as all the mRNAs measured have the same number of MBS. However, normalized brightness of the red channel directly correlated with the number of PBS stem loops in the mRNA (Figure 1D). Importantly, only one binding site inserted into the mRNA was sufficient to distinguish it from no binding site at all. This measurement is critical because this provides an absolute value when one single RBP binds to an mRNA (see below).

#### Interaction between ZBP1 and β-Actin mRNA

We applied HSP to study the interaction between ZBP1 and  $\beta$ -actin mRNA. To image endogenous  $\beta$ -actin mRNA, we used a transgenic mouse in which 24xMBS was inserted into the 3' UTR of the β-actin gene (Lionnet et al., 2011). To image endogenous ZBP1, we used cells isolated from ZBP1-/- embryos and reintroduced a tagged variant of ZBP1. Since homozygous ZBP1<sup>-/-</sup> is perinatal lethal, it was not possible to establish a ZBP1<sup>-/-</sup> mouse line (Katz et al., 2012). Heterozygous ZBP1<sup>+/-</sup> mice (Katz et al., 2012) were crossed with the  $\beta$ -actin MBS mouse to generate a ZBP1+/- MBS mouse, which were mated to obtain primary or immortalized embryonic ZBP1-/- MBS cells (Supplemental Experimental Procedures). We introduced mCherry-labeled ZBP1 into immortalized ZBP1-/- MBS MEF cells using lentivirus (Supplemental Experimental Procedures). In order to obtain expression of mCherry-ZBP1 equivalent to endogenous levels, we obtained stable cell lines expressing various amounts of mCherry-ZBP1 using fluorescence-activated cell sorting. We verified the levels of mCherry-ZBP1 in these cell lines by western blot and compared them to ZBP1 levels in wildtype MEFs (Figure S2). We then imaged the mRNA and ZBP1 interactions on these cells by FFS. We focused the laser in a cytoplasmic spot near the nucleus and counted photons for 3 min. The data were then analyzed with the three-species HSP model. Typically, over a 3-min observation period, we counted hundreds to thousands of mRNAs. The normalized green channel brightness of the heterospecies was 13  $\pm$  2 (Figure 2A), indicating that about half of the expected 24 MBS were occupied by tdMCP-EGFP. This is in agreement with the single color measurement of mRNA brightness (Wu et al., 2012).

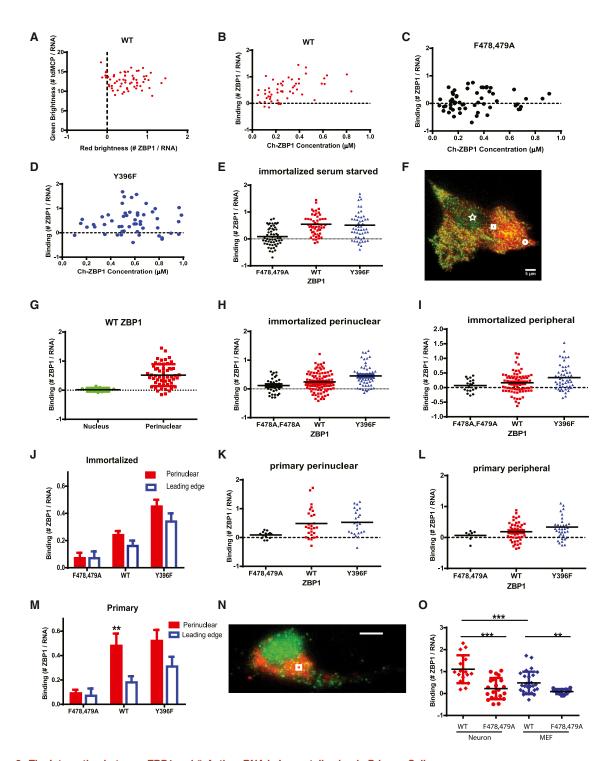


Figure 2. The Interaction between ZBP1 and β-Actin mRNA in Immortalized or in Primary Cells

The ZBP1<sup>-/-</sup> MBS MEF cells were infected by lentivirus expressing NLS-tdMCP-EGFP and mCherry-Flag-ZBP1. The immortalized cells were sorted for endogenous level of ZBP1 expression (Figure S2).

(A–E) The cells were serum-starved overnight and measured at the perinuclear region for 3 min. The data were fit by the HSP model. (A) The normalized brightness of the heterospecies. The green channel brightness scattered  $\sim 13 \pm 2$  MCP-EGFP per mRNA. The red channel brightness was >0, indicating that ZBP1 bound to mRNA. The negative binding is due to subtracting the spectral bleed-through of EGFP in the red channel. (B) The normalized red channel brightness  $\tilde{\lambda}_{R,H}$ , which measured the average number of ZBP1 bound to an mRNA, was plotted against the concentration of mCherry-Flag-ZBP1. The same experiments were performed as in (A) and (B) except that the ZBP1 mutant mCherry-ZBP1 $_{F478A, F479A}$  (C) or mCherry-ZBP1 $_{Y396F}$  (D) was used to substitute for wild-type ZBP1. The

(legend continued on next page)

The normalized red channel brightness of heterospecies was used to measure the average number of ZBP1 proteins associated with the mRNA (Figures 2A and 2B). Each symbol in the plot is a measurement of a single cell and it represents the ensemble average of interactions between ZBP1 and the mRNA in the laser focal volume (the average is  $0.55 \pm 0.06$ ; a value of zero would mean no interaction and a value of one means all measured mRNAs contain one ZBP1 protein on average). The concentration of mCherry-ZBP1 was calculated using the red channel fluorescence intensity and brightness of mCherry. Surprisingly, the binding appeared relatively insensitive to concentration, suggesting that other factors may also play a role in binding. We compared these results to a ZBP1 mutant, ZBP1<sub>E478A, E479A</sub>, that cannot bind the mRNA. Disruption of the linker region (F478A, F479A) between KH3 and KH4 disrupts the binding of ZBP1 to β-actin mRNA (Chao et al., 2010; Ross et al., 1997). Over the same concentration range as the wild-type ZBP1, mRNAs bound an average of 0.07  $\pm$  0.04 mutant proteins (Figures 2C and 2E), equivalent to a lack of interaction. We also investigated the ZBP1<sub>Y396F</sub> mutant, which cannot be phosphorylated, allowing protein release and therefore is predicted to remain bound to β-actin mRNA (Hüttelmaier et al., 2005). We found that under serum starvation conditions, mRNAs bound 0.5 ZBP1, both WT or mutant ZBP1<sub>Y396F</sub> (Figures 2D and 2E). However, in normal medium (10% FBS) the ZBP1<sub>Y396F</sub> mutant bound the same as in starvation conditions while the wild-type (WT) ZBP1 reduced its mRNA binding. This is likely due to enhanced phosphorylation of the serine 396 under normal conditions. During periods of starvation ZBP1 remains dephosphorylated leading to repression of translation.

One of the advantages of FFS is the ability to measure molecular interactions in precise cellular locations because of the femtoliter spot size. It has been previously hypothesized that  $\beta$ -actin binds to ZBP1 in the nucleus such that it is repressed for translation once it enters the cytoplasm (Hüttelmaier et al., 2005). Therefore, we wanted to address whether ZBP1 was loaded on mRNA in the nucleus using this sensitive approach. Because nuclear  $\beta$ -actin mRNA concentration is typically low, to achieve sufficient mRNA counts in nucleus, we serum stimulated the cells after overnight serum starvation to induce mRNA transcription and performed FFS measurements in the nucleus (Figure 2F,

star) within 45 min post stimulation. Unexpectedly, the data showed that ZBP1 was not bound to β-actin mRNAs in the nucleus (Figure 2G). Therefore, our results indicate that ZBP1 must bind to mRNA either in the nuclear periphery, or after it exits the nucleus, in contrast to what has been hypothesized. Next, we focused on the interaction in the cytoplasm, more specifically, the leading edge (Figure 2F, circle) and perinuclear regions (Figure 2F, square). In immortalized MEFs (Figures 2H and 2l), we found that ZBP1 bound β-actin mRNAs almost equally in both compartments (p > 0.1) (Figure 2J). It has been shown previously that β-actin mRNA localized to the leading edge of primary chicken fibroblasts, but this localization phenotype has been lost in immortalized cells (Park et al., 2012). Therefore, we measured the interaction at the perinuclear region (Figure 2K) and the leading edge (Figure 2L) in primary MEFs, obtained from ZBP1<sup>-/-</sup> embryos. The mCherry-ZBP1 was introduced by lentivirus (Supplemental Experimental Procedures) and calibrated to be in the same concentration range as that of the immortalized cells. In primary MEFs, the average number of ZBP1 molecules bound to β-actin mRNA in the perinuclear region (0.48  $\pm$  0.1) was double that in the immortalized cells (0.24  $\pm$  0.03) and comparable to the binding in the serum-starved condition for immortalized cells. Importantly, we found that more ZBP1 bound to β-actin mRNA in the perinuclear region than in the leading edge of the cell (0.18  $\pm$  0.05) (Figure 2M). Perinuclear ZBP1 $_{Y396F}$  bound to  $\beta$ -actin mRNA similarly to the WT (0.52  $\pm$ 0.09), but in the leading edge, there were more ZBP1<sub>Y396F</sub> bound to  $\beta\text{-actin}$  mRNA (0.45  $\pm$  0.05) than the WT. These results provide a quantitative corroboration that ZBP1 binds  $\beta$ -actin mRNAs in the nuclear periphery and that phosphorylation of Y396F on ZBP1 leads to the release of the mRNA at the leading edge. This is consistent with the hypothesis that the removal of ZBP1 asymmetrically leads to translation at the leading edge and consequent cell polarization and directed migration (Park et al., 2012).

We investigated the interaction between ZBP1 and  $\beta$ -actin mRNAs in cultured primary ZBP1 $^{-/-}$  MBS hippocampal neurons (Supplemental Experimental Procedures). It has been shown that  $\beta$ -actin mRNAs localize in neuronal processes and are masked in RNA granules, possibly involving ZBP1 for enhanced translation repression compared to other cell types (Buxbaum

concentrations of ZBP1 mutant were chosen to be in the similar range  $(0-1 \mu M)$  to that of the wild-type. The binding of the ZBP1 and its mutants to the mRNA was summarized and compared (E): mCherry-ZBP1<sub>F478A, F479A</sub> did not bind to mRNA and mCherry-ZBP1<sub>Y396F</sub> bound similarly to wild-type.

<sup>(</sup>F–J) The interaction between ZBP1 and  $\beta$ -actin mRNA in different cellular compartments in immortalized MEF. (F) An example of measurement location (star, the nucleus; circle, the leading edge; square, the perinuclear region). Red, mCherry-ZBP1; green, tdMCP-EGFP. (G) ZBP1<sup>-/-</sup> MBS MEFs were serum-stimulated and FFS experiments were conducted in nucleus during the first 45 min post stimulation. ZBP1 does not associate with  $\beta$ -actin mRNA in nucleus. (H–J) In normal growth medium with 10% FBS, the average number of mCherry-ZBP1 or mutants bound to  $\beta$ -actin mRNA in the perinuclear region (H) and the leading edge (I) were plotted. (J) Comparison of the binding of ZBP1 to  $\beta$ -actin mRNA in the perinuclear region to the leading edge. There was no significant difference between the perinuclear region and in the leading edge. The p value for unpaired t test was 0.8, 0.12, and 0.08 for WT, ZBP1<sub>Y396F</sub>, and ZBP1<sub>F478A,F479A</sub> mutants, respectively. Error bars, SEM.

<sup>(</sup>K–M) The interaction between ZBP1 and  $\beta$ -actin mRNA in primary MEF. ZBP1 $^{-/-}$  MBS MEF cells were prepared and infected with NLS-tdMCP-EGFP and mCherry-Flag-ZBP1 or its mutants (Supplemental Experimental Procedures). The average number of ZBP1 binding to mRNA in perinuclear (K) or in the leading edge (L) were plotted for various mutant. (M) Comparison of ZBP1 interacting with  $\beta$ -actin mRNA in different compartments in primary MEFs. In the perinuclear region, there was a higher percentage of  $\beta$ -actin mRNA associated with ZBP1 than in the leading edge. Error bars, SEM.

<sup>(</sup>N and O) The interaction between ZBP1 and  $\beta$ -actin mRNA in somata of cultured primary hippocampal neurons, embryonic day 18, days in vitro (DIV) = 4–7. (N) A representative image shows the perinuclear measurement location in the soma. Green, NLS-tdMCP-GFP; red, mCherry-ZBP1. (O) The binding of ZBP1 to  $\beta$ -actin mRNA in soma of neurons compared with perinuclear region in primary MEFs. (\*p < 0.05, \*\*p < 0.01, \*\*\*p < 0.001). Error bar, SD. See also Figure S2.

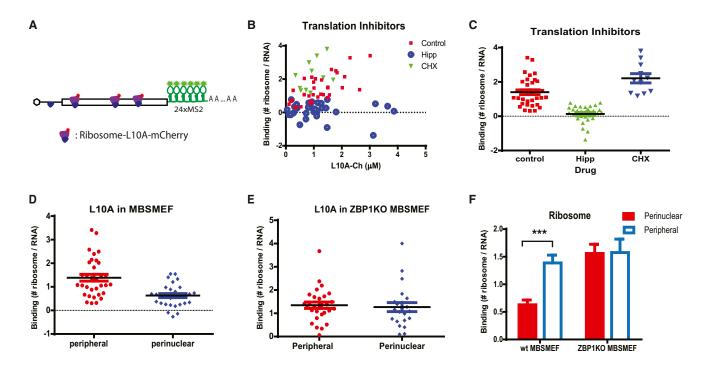


Figure 3. The Association of Ribosomes with  $\beta$ -Actin mRNA in Primary MEF

(A) The schematic shows the labeling of large ribosomal subunits by rpL10-mCherry. Primary ZBP1<sup>-/-</sup> or WT MBS MEF cells were prepared and infected with NLS-tdMCP-EGFP and rpL10A-mCherry (Experimental Procedures).

(B) The association of ribosomes with the mRNA in the presence of translation inhibitors in WT MBS MEF. The number of ribosomes bound per mRNA was plotted as a function of the rpL10A-mCherry concentration. Hippuristanol (Hipp: 1 uM/ml) inhibited translation initiation and abolished the association of ribosomes with mRNA. In contrast, cycloheximide (CHX: 2ug/ml) increased the number of ribosomes on mRNA since it slowed down the elongation speed.

(C) Summary of the average number rpL10A-mCherry associated with mRNA in the presence of translation inhibitors. Error bars, SEM.

(D–F) FS experiments were performed in different cellular compartments. The number of ribosomes binding to β-actin mRNA in the leading edge or perinuclear region was compared in primary WT MBS MEFs (D) and ZBP1<sup>-/-</sup> MBS MEF (E). (F) Comparison of ribosome association with mRNA in different cellular regions. There were fewer ribosomes per β-actin mRNA in perinuclear region than in the leading edge in WT MBSMEF. If ZBP1 was knocked out, however, there is no difference in ribosome loading. (\*p < 0.05, \*\*p < 0.01, \*\*\*p < 0.001). Error bars, SEM. See also Figure S3.

et al., 2014). Therefore, neurons may exhibit enhanced binding of ZBP1 leading to repression of translation of  $\beta$ -actin mRNAs. We focused on the interaction in soma since we anticipated that ZBP1 plays an elevated role by packaging the mRNA for transport compared to non-neuronal cells (Figure 2N). We expressed mCherry1-ZBP1 with lentivirus infection and conducted FFS experiments in primary ZBP1<sup>-/-</sup> MBS<sup>+/+</sup>neurons after 4-7 days in vitro (DIV). In contrast to fibroblasts, we measured a significantly higher interaction between WT ZBP1 and β-actin mRNAs (Figure 20) in neurons and on average all mRNAs were bound to a ZBP1 protein. ZBP1  $_{\mbox{\scriptsize F478A},\mbox{\scriptsize F479A}}$  did not interact as well with the mRNA, but showed more substantial association than with MEFs. This suggests that in the neuronal soma, ZBP1, in combination with other proteins, has an enhanced participation in the formation of RNA granules, including β-actin mRNAs, and in repressing translation until the mRNA reaches its final destination.

#### Association of Ribosomes with β-Actin mRNA

The localization and translational regulation of mRNA are coupled through the binding of ZBP1. The purpose of mRNA localization is to achieve asymmetric protein distribution. Therefore, localization is usually coupled to a mechanism that re-

presses translation of non-localized mRNA while allowing translation of localized mRNA to occur (Hüttelmaier et al., 2005). However, direct observation of this process in live cells has not been possible previously. In order to correlate localization with translation we applied HSP to measure ribosome association with β-actin mRNA. We chose the ribosomal protein rpL10A to label ribosomes (Figure 3A). Previously, it has been shown that mice with rpL10A tagged by GFP are viable (Heiman et al., 2008) indicating that fluorescent tagging does not alter translation efficiency. We established MBS MEF cell lines with rpL10A-mCherry stably expressed. To demonstrate that rpL10A-mCherry was successfully incorporated into ribosomes, we purified the ribosomes by ultracentrifugation followed by western blot detection of rpL10A (Figures S3A and S3B). Approximately 40% of ribosomes were labeled with mCherry.

We measured the interaction of ribosomes with  $\beta$ -actin mRNA in primary MBS MEF cells. The normalized red channel brightness was plotted as a function of rpL10A-mCherry concentration (Figure 3B). As the concentration of rpL10A-mCherry increased, the brightness ranged from 0 to more than 3, with an average of  $1.4\pm0.14$  fluorescent ribosomes per mRNA. Since  ${\sim}40\%$  of ribosomes were labeled, this corresponded to  ${\sim}3.5$  ribosomes

bound to each mRNA in the leading edge. Polysome analysis showed that 80%  $\beta\text{-}actin$  mRNAs existed in polysomes in HeLa cells (Sanchez et al., 2007), indicating that this house-keeping gene is constitutively actively translated. We then tested the effect of various translation inhibitors on ribosome binding in MEF cells (Figures 3B and 3C). Treatment with hippuristanol (1  $\mu\text{M}$ ), an inhibitor of the translation initiation factor eIF4A (Bordeleau et al., 2006), completely eliminated ribosome association with mRNA (Figures 3B and 3C). Additionally, the diffusion coefficient of mRNA increased (Figures S3C and S3D), further indicating that ribosomes did not associate with the mRNA. In contrast, when treated with a low concentration of cycloheximide (2  $\mu\text{g/ml}$ ), an inhibitor of translation elongation, ribosome association with mRNA increased over the control (Figures 3B and 3C) and mRNA diffusion slowed (Figures S3C and S3D).

We further compared the association of ribosomes with  $\beta\text{-}actin$  mRNA in different cellular compartments. We noticed that there were fewer ribosomes per mRNA (approximately one per mRNA correcting for the label dilution) in the perinuclear region than in the leading edge (3.5 per mRNA) in ZBP1 $^{+/+}$  MBS MEFs over the range of rpL10A-mCherry concentration measured (Figures 3D and 3F). However, in MEFs lacking ZBP1, ribosome association in both compartments was comparable to the leading edge in ZBP1 $^{+/+}$  MEF (Figures 3E and 3F). Therefore, the association of ribosomes with  $\beta\text{-}actin$  mRNA in WT cells was anti-correlated to the ZBP1- $\beta\text{-}actin$  mRNA interaction (Figure 2M). In ZBP1 $^{-/-}$  cells, there was increased ribosome association at the nuclear periphery, confirming that the cells were unable to establish asymmetry of translation, leading to loss of polarity and directed migration.

#### **DISCUSSION**

Currently, no method exists that can observe native protein-RNA interactions in single living cells in real time. We applied heterospecies partition analysis (HSP) of FFS, combined with single molecule mRNA detection with the MS2 system, to measure the molecular associations between a protein and an mRNA in different locations and in different cell types. This subcellular resolution, capable of determining the interaction dynamics in various cellular compartments is vital for investigating the cellular regulation of mRNA expression. Here, we measure the interactions in select compartments in two cell types: fibroblasts (transformed and primary) and neurons. In principle, this method could be generalized to an imaging approach to map the interaction in each pixel of an image (Ross et al., 2011). However, the RNA concentration is in general much lower than proteins and the time for each point measurement may be prohibitive.

Because HSP measures interactions directly in single live cells, it provides information about the variance among cells in the population and in cellular regions, resulting in the ability to correlate protein-RNA interactions with cell behavior and morphology. For instance, it has long been hypothesized that an mRNP is continuously remodeled starting from transcription to degradation; however, traditional approaches lack sufficient quantitative measures and spatiotemporal precision. HSP allowed us to directly measure some of these events and build a quantitative model of  $\beta$ -actin mRNA regulation. To demonstrate

this, we applied HSP to study the interaction between endogenous  $\beta$ -actin mRNA with ZBP1 or ribosomal subunits. In contrast to our original hypothesis (Hüttelmaier et al., 2005), ZBP1 did not bind to  $\beta$ -actin mRNA in the nucleus. Therefore, we conclude that ZBP1 is likely loaded onto the mRNA perinuclearly after export, although we cannot rule out an interaction occurring close to the nuclear pores. In neurons, we measured enhanced ZBP1-β-actin mRNA binding perinuclearly. We propose that this enhanced interaction underlies differences in the  $\beta$ -actin mRNA behavior in neurons, where mRNA is packaged into granules and transports long distances (Buxbaum et al., 2014). Our measurements demonstrate possible cell-specific mechanisms whereby expression of the same RBPs can result in alternate mRNA regulation. In MEFs, ZBP1 and ribosome binding to the β-actin mRNA were anti-correlated when comparing the perinuclear with the peripheral regions in fibroblasts: half of all mRNAs in the perinuclear region were associated with ZBP1 and had an average of approximately one ribosome per mRNA whereas <20% of mRNAs in the periphery contained ZBP1 and the average mRNA had almost four ribosomes associated. This is the direct quantification of ribosome loading onto a specific mRNA in living cells. Note ribosomes on RNA are not equivalent to active translation since they may be stalled. Nevertheless, we are using ribosome loading as a proxy for translational activity. We thus demonstrated a spatial dependence on this translation. Furthermore, we were able to investigate how the nature of translational activity was spatially altered with the loss of ZBP1. Because of the specificity of our approach, we were also able to obtain the range of these numbers in individual cells: from zero to two ribosomes perinuclearly compared to one to eight ribosomes per mRNA peripherally after correction. This variance can be attributed in part to the varying amounts of ZBP1 binding or perhaps due to the stochasticity in the low number of receptors in normal cells that sense the environmental fluctuations of growth factors that induce phosphorylation of the protein. Interestingly, our measurements demonstrate that the notable difference in ZBP1-/- MEFs was enhanced ribosomal loading on perinuclear mRNA. This suggests that a loss of translational repression in the center of the cell may play a role in the loss of polarization and motility observed in ZBP1<sup>-/-</sup> MEFs (Katz et al., 2012). The temporal and spatial interactions between ZBP1 and ribosomes with β-actin mRNA are summarized in a working model (Figure 4). Hence, the method described here allows the measurement of both in single cells as well as in the population and provides a basis for modeling where and how specific mRNAs are regulated.

The single cell analysis compares the binding properties of ZBP1 in vivo with its behavior in vitro. It has been previously reported that ZBP1 KH34 binds to the  $\beta$ -actin zipcode with the same affinity of the full-length protein in vitro. The other domains do not bind to the zipcode. However, it is unknown whether other parts of  $\beta$ -actin mRNA contain unidentified binding sites for ZBP1, or other proteins may assist in its binding. The ZBP1\_F478A, F479A mutant disrupts the linker region between KH3 and KH4 domains and does not interact with  $\beta$ -actin mRNA in vitro (Chao et al., 2010). Because cellular binding was not seen as well, the in vitro and in vivo results agree and KH34 must be solely responsible for the binding of ZBP1 to  $\beta$ -actin mRNA in living cells.

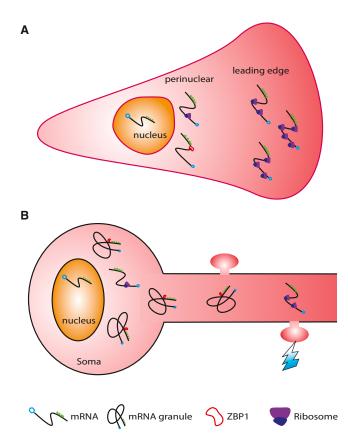


Figure 4. Working Model Compatible with the Localized Interaction Observed in Figures 2 and 3

When  $\beta$ -actin mRNA is in the perinuclear region, ZBP1 interacts with the mRNA to repress its translation. When the mRNA reaches the leading edge of the fibroblast (A), it releases ZBP1 and translates more actively. In the soma of neurons, ZBP1 binds more effectively to  $\beta$ -actin mRNA in the perinuclear region (B) than in the fibroblast, likely to assemble the mRNA into granules and inhibit translation more completely until the mRNA is transported to dendrites (Buxbaum et al., 2014).

It has been shown that  $\beta$ -actin mRNA localizes to the leading edge of primary fibroblasts. But in immortalized cells, this localization phenotype is diminished. The exact reason for the loss of phenotype is unclear, but perhaps is due to the high levels of phosphorylation in immortalized cells. Enhanced phosphorylation has been suggested to release ZBP1 from the mRNA (Hüttelmaier et al., 2005), therefore loss of ZBP1 regulation may play a role in the difference between immortalized and primary cells. Our results show that ZBP1 interacts with  $\beta$ -actin mRNA less efficiently in the perinuclear region in immortalized cells than in primary MEFs. These results provide an explanation for the observation that in metastatic cells, the mRNA is unable to localize efficiently and hence maintain a polarized phenotype and proper cell adhesion, allowing the cells to disseminate (Gu et al., 2012; Katz et al., 2012; Lapidus et al., 2007).

Questions regarding RNA granule composition and heterogeneity can be addressed with the methodology described here. This approach may be generally applied to any mRNA-protein combination, and with additional fluorophores, to larger com-

plexes of mRNAs or proteins, allowing the investigation of dependent, mutually exclusive, or symbiotic protein interactions on single mRNAs. Although we demonstrate the proof-of-principle here using a mouse knockin for labeling the mRNA and a knock out for ZBP1, which we replaced with a fluorescent version of the protein, this would not be necessary for investigating many mRNA-protein interactions. Use of the CRISPR-Cas9 recombinase system (Mali et al., 2013) can allow the introduction of fluorescent tags and stem loops to allow imaging of endogenous molecules without generating transgenic animals. As illustrated in this work with the use of labeled ribosomal subunits, quantitative interactions can be extrapolated from the percent labeled mRNA or protein introduced exogenously compared to the endogenous levels. However, care must be taken not to increase either component substantially and thus perturb native reaction stoichiometry or kinetics. To this end, the use of small hairpin RNAs (shRNAs) to knock down both components is a routine procedure. The HSP microscopy is not yet routine, but is achievable through various commercial two-photon microscopes capable of photon counting. The analysis tools we provide online with this publication will allow calculation of the binding constants and equilibrium values for these interactions. By this approach, important regulatory molecules and their mRNA targets discovered through high throughput approaches (Hafner et al., 2010; Ule et al., 2003) can be verified and evaluated in detail at the single cell level.

#### **EXPERIMENTAL PROCEDURES**

## Derivation of the Heterospecies Partition Analysis for Protein-mRNA Interaction

The detailed derivation and theoretical predictions were listed in the Supplemental Experimental Procedures. Here, we define the variable and give the theoretical result essential for understanding the paper.

In dual-color FFS experiment, the brightness of species S in detection channel j is described by  $\lambda_{j,S}$ , where j=R for the red and j=G for the green detection channel. In a mixture of mRNA M, RNA binding protein P and their different oligomeric states, [M, P, P<sub>2</sub>, MP, MP<sub>2</sub> ...], the hetero-species H includes M and its complexes with P (H = [M, MP, MP<sub>2</sub>, ...]) (Figure 1A). The red channel heterospecies brightness  $\lambda_{R,H}$  depends on the relative concentration of each constitutive species and is used to measure the degree of binding between mRNA and protein.

$$\lambda_{\mathbf{R},H} = \lambda_{\mathbf{R},M} + y \times \lambda_{\mathbf{R},P}$$
,

where  $y=\sum_{i=0}^n i \times N_{MP_i}/\sum_{i=0}^n N_{MP_i}$  and  $N_i$  is the concentration of the j-th species. The normalized brightness  $\tilde{\lambda}_{\mathbf{R},\mathbf{H}}=(\lambda_{\mathbf{R},\mathbf{H}}-\lambda_{\mathbf{R},\mathbf{M}})/\lambda_{\mathbf{R},P}=y$  measures the degree of binding y for reaction  $\mathbf{M}+n$   $\mathbf{P} \overset{K_0}{\longleftrightarrow} \mathbf{MP}_n$ .

### Fluorescence Fluctuation Spectroscopy and Data Analysis

The FFS microscope, built around an Olympus IX-71 stand, has been discussed previously (Wu et al., 2012). Briefly, a 60× Plan-Apo oil immersion objective (NA = 1.4, Olympus) was used to focus the mode locked Ti:Sapphire laser (Chameleon Ultra, Coherent) and collect fluorescence. The back scattered laser was eliminated by two short-pass filters (ET680sp-2p8, Chroma). The fluorescence was separated into two detection channels with a dichroic mirror (565DCXR, Chroma). Each channel was equipped with a band pass filter (FF01-525/50-25 for green and FF01-630/92-25, Semrock). The spectra of EGFP and mCherry were plotted in Figure S1A with the transmission curves of dichroic mirror and filters. With this choice of filter sets, the fluorescence of mCherry in the green channel could be completely eliminated, but there was a small residual signal for EGFP in the red channel. Two avalanche photodiodes (APD) (SPCM-AQR-14, Perkin-Elmer) detected photons in each

channel. The output of the APD, which produced TTL pulses, was directly connected to a two-channel data acquisition card (FLEX02, Correlator.com). The recorded photon counts were stored and later analyzed with programs written in IDL (ITT Exelis).

The brightness in each channel of EGFP ( $\lambda_{\textbf{R},\text{EGFP}},~\lambda_{\textbf{G},\text{EGFP}}$ ) and mCherry  $(\lambda_{\textbf{R},\text{mCherry}},~0)$  were determined by independent measurements of cells expressing each protein alone. Since the measured brightness depended on the thickness of the cell (Macdonald et al., 2010), we calibrated the brightness separately in the perinuclear and in the peripheral regions of the cell. The brightness of EGFP and mCherry in each compartment then served as a standard and were used to predict the brightness of the hetero complex MP<sub>n</sub> according to the two-brightness-state model of mCherry (Wu et al., 2009). Occasionally, there were unknown bright red autofluorescent particles passing through the laser focus, which produced large red fluorescent spikes. These spikes were removed in the post-acquisition analysis, as demonstrated in Figure S1F. The FFS data were analyzed by dual-color time-integrated fluorescence cumulant analysis (TIFCA) (Wu et al., 2006) using the three-species HSP model. The first species was tdMCP-EGFP, which was a monomer and had the same brightness with EGFP. For simplicity and robustness of fitting, the brightness and diffusion time of this species was fixed to the value from independent measurement, but the number of molecules was left as a free-fitting parameter. The second species was the free RBP-mCherry. By definition, its green brightness was fixed to zero. The third species was the heterospecies, whose FFS parameters were set as free fitting parameters. The brightness of heterospecies was the major focus for our analysis. For better interpretation, we presented the normalized brightness, defined as  $\tilde{\lambda}_{\mathbf{G},H} = \lambda_{\mathbf{G},H}/\lambda_{\mathbf{G},EGFP}$  and  $\tilde{\lambda}_{\mathbf{R},H} = (\lambda_{\mathbf{R},H} - \lambda_{\mathbf{R},M})/\lambda_{\mathbf{R},P}$ , which described the number of EGFP and mCherry in the mRNP, respectively (Wu et al., 2009, 2010).

#### Generation of ZBP1<sup>-/-</sup> MBS Mouse Cells

Animal studies were performed in accordance with IACUC protocol 20131011s at Albert Einstein College of Medicine. The mouse with 24xMBS knocked into the 3' UTR of the *Actb* gene (MBS mouse) was described previously (Lionnet et al., 2011). Crossing the MBS mouse with a ZBP1 heterozygous mouse enables us to generate the ZBP1+/- MBS mouse. These ZBP1 heterozygous mice were mated to generate ZBP1-/- MBS embryos as shown in the Supplemental Experimental Procedures.

#### SUPPLEMENTAL INFORMATION

Supplemental Information includes Supplemental Experimental Procedures and three figures and can be found with this article online at http://dx.doi.org/10.1016/j.cell.2015.05.054.

#### ACKNOWLEDGMENTS

We would like to thank Jeffrey A. Chao for the construct of ZBP1 $_{\rm F478A,\ F479A}$  mutant and Xiuhua Meng for cloning the plasmids used in the manuscript. The translation initiation inhibitor hippuristanol is a generous gift from Dr. Jerry Pelletier. This work was supported by NIH grant R01 NS083085 to R.H.S.

Received: January 26, 2015 Revised: May 4, 2015 Accepted: May 19, 2015 Published: July 2, 2015

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