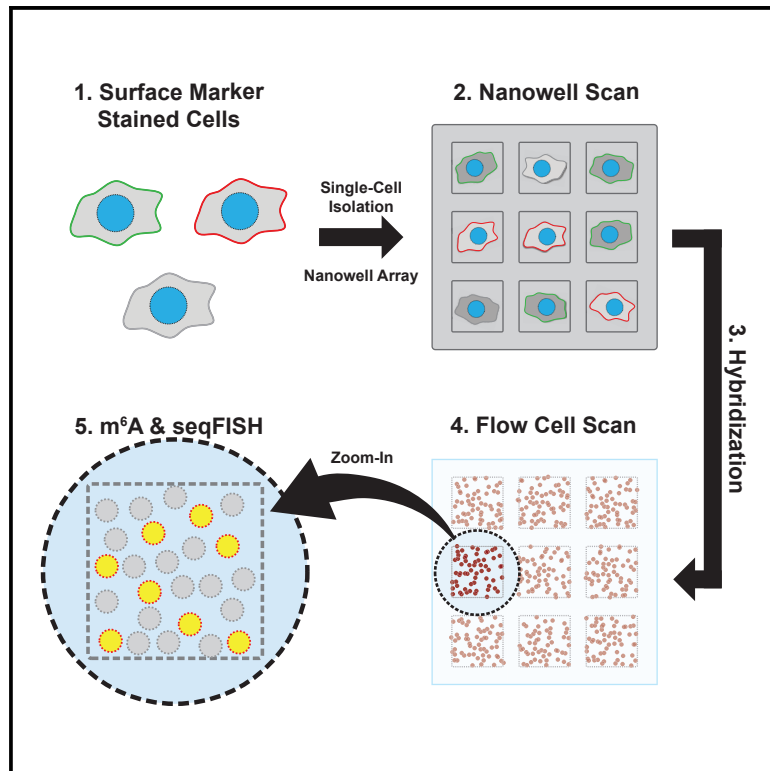


Systematic detection of m⁶A-modified transcripts at single-molecule and single-cell resolution

Graphical abstract



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In brief

Kim et al. develop a microscopy-based platform for epitranscriptome profiling, compatible with low-input samples and single cells. The platform provides multi-modal measurements of cell surface markers, gene expression, and m⁶A RNA modification. The system is flexible and can be applied to study various RNA modifications and their dynamics in heterogeneous cell mixtures.

Highlights

- Microscopy-based epitranscriptome profiling of low-input samples and single cells
- Single-molecule detection of m⁶A-modified RNA molecules
- Measurements of multiple modalities from the same single cells



Article

Systematic detection of m⁶A-modified transcripts at single-molecule and single-cell resolution

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MOTIVATION Chemical modifications of mRNA affect diverse biological processes and are of crucial importance to cellular functions. However, the methodologies currently available to study these modifications are limited and incompatible with low-input samples or single cells. To overcome these limitations, we developed a microscopy-based platform to directly capture native mRNAs from cell lysates and detect m⁶A-modified RNA molecules at single-molecule resolution. Furthermore, we incorporated nanoscale technology to resolve single cells and thereby measure surface markers, gene expressions, and m⁶A levels on the same cells.

SUMMARY

Epigenetic modifications control the stability and translation of mRNA molecules. Here, we present a microscopy-based platform for quantifying modified RNA molecules and for relating the modification patterns to single-cell phenotypes. We directly capture mRNAs from cell lysates on oligo-dT-coated coverslips, then visually detect and sequence individual m⁶A-immunolabeled transcripts without amplification. Integration of a nanoscale device enabled us to isolate single cells on the platform, and thereby relate single-cell m⁶A modification states to gene expression signatures and cell surface markers. Application of the platform to MUTZ3 leukemia cells revealed a marked reduction in cellular m⁶A levels as CD34⁺ leukemic progenitors differentiate to CD14⁺ myeloid cells. We then coupled single-molecule m⁶A detection with fluorescence *in situ* hybridization (FISH) to relate mRNA and m⁶A levels of individual genes to single-cell phenotypes. This single-cell multi-modal assay suite can empower investigations of RNA modifications in rare populations and single cells.

INTRODUCTION

Chemical modifications of mRNA regulate transcript and protein abundance, thereby affecting cellular state. In addition to 5' cap and 3' polyadenylation, mRNAs can be modified via bases such as pseudouridine (Ψ), and methylation of adenosine and cytosine to produce N⁷-methyladenosine (m¹A), N⁶-methyladenosine (m⁶A), and 5-methylcytosine (m5C) (Frye et al., 2018). The most abundant of these modifications is m⁶A, the levels of which vary widely between cell types and states, and 20%–40% of all mRNAs contain one or more m⁶A modifications (Dominissini

et al., 2012; Frye et al., 2018; Meyer et al., 2012). m⁶A and its cognate writers, readers, and erasers have therefore emerged as essential regulators of gene expression (Yang et al., 2018).

Recent advances in transcriptome-wide m⁶A mapping technologies have broadened our understanding of m⁶A distribution and function (Dominissini et al., 2012; Meyer et al., 2012), but much is still out of reach. Antibody-based methods, such as m⁶A sequencing, MeRIP sequencing, and m⁶A-LAIC sequencing (m⁶A-LAIC-seq), provided the first transcriptome-wide view of m⁶A but require large amounts of input RNA (1~3 μ g) (Dominissini et al., 2012; Meyer et al., 2012; Molinie



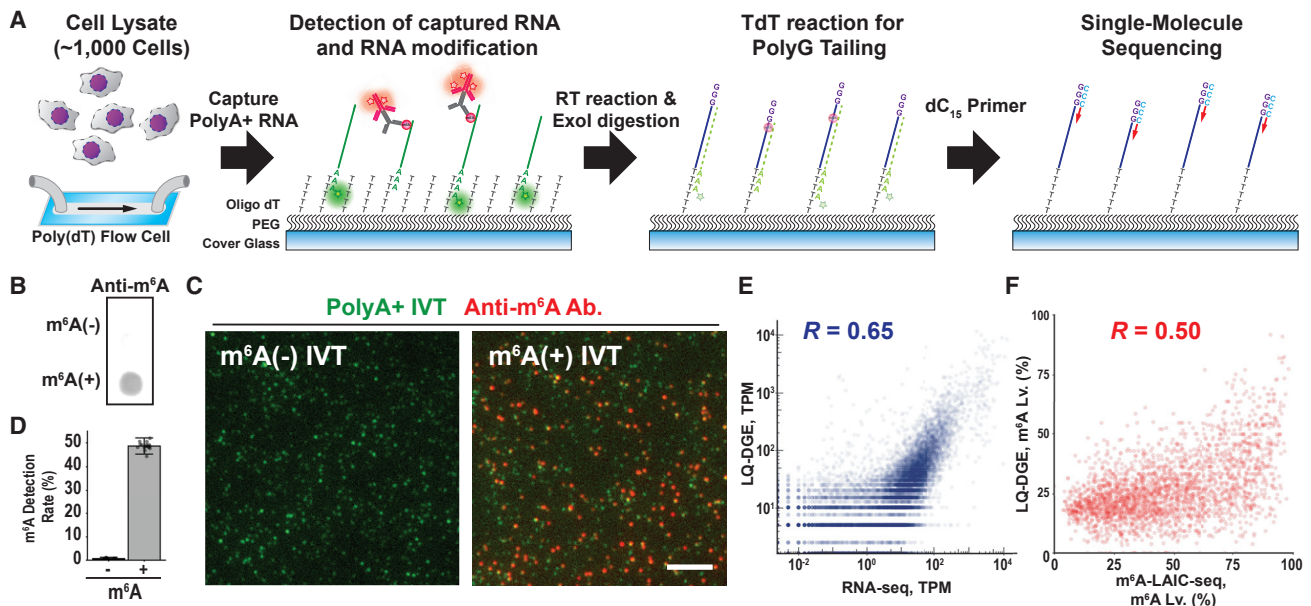


Figure 1. Transcriptome-wide m⁶A profiling at single-molecule resolution

(A) LQ-DGE with m⁶A detection. PolyA⁺ RNA from ~1,000 GM12878 cells was captured on an oligo-dT-coated coverslip followed by antibody detection of m⁶A. Single-molecule sequencing of all transcripts was then performed by reverse transcription followed by second-strand cDNA synthesis. TdT, terminal deoxynucleotidyl transferase.

(B) Dot blot assay with *in vitro* synthesized m⁶A^{-/+} transcripts (*in vitro* generated transcripts [IVTs]) using anti-m⁶A antibody. m⁶A⁻ IVTs were unmodified, and m⁶A⁺ IVTs contained an average of 12 m⁶ATP nucleotides per transcript.

(C) TIRF microscopy images showing m⁶A⁻ or m⁶A⁺ Cy3-labeled IVTs (green) stained with an anti-m⁶A antibody and an Alexa Fluor 647-conjugated secondary antibody (red). Scale bar, 5 μm.

(D) Quantification of m⁶A detection rates by analyzing colocalization of anti-m⁶A antibody and Cy3 fluorescence signals.

(E) Scatterplot showing the correlation between modified LQ-DGE (0.51 M reads) and RNA sequencing (RNA-seq) (50 M reads) data for GM12878 cells.

(F) Scatterplot showing the correlation between gene-specific m⁶A levels from the LQ-DGE (total, 0.51 M reads and m⁶A⁺, 0.14 M reads) and those from m⁶A-LAIC-seq (m⁶A-negative or m⁶A-positive sample, each 50 M reads). See also Figure S1 and Table S1.

et al., 2016). Innovations in enzyme-based methods, such as MAZTER sequencing (Garcia-Campos et al., 2019) and DART sequencing (Meyer, 2019), reduce the RNA input requirement (10–100 ng) but are still limited to bulk samples and require complex library preparation. To build quantitative models of the impact of mRNA modifications on gene expression and cellular state, we require technologies that can quantify RNA modifications and transcript abundance—and ideally other measures of cellular state, such as surface markers—within single cells.

Toward this goal, we developed a microscopy-based platform to measure cell surface markers, gene expression, and m⁶A levels in individual cells and at single-molecule resolution. We combined innovations in nanowell technology (Gierahn et al., 2017), image registration, low-quantity digital gene expression (LQ-DGE) (Ozsolak et al., 2009), and sequential fluorescence *in situ* hybridization (seqFISH) (Eng et al., 2017) to generate data encompassing multiple parameters from single cells.

RESULTS

We began by redesigning LQ-DGE technology, which combines sequential base additions with single-molecule total internal reflection fluorescence (TIRF) imaging (Ozsolak et al., 2009, 2010). We designed a surface with high antifouling performance

to capture mRNA molecules (Figure 1A; STAR Methods). Briefly, we treated coverslips with azide-functionalized polyethylene glycol (PEG) to reduce non-specific binding of other biomolecules (Kim et al., 2018). We then coated the coverslips with alkyne-oligo-dT by copper-catalyzed azide-alkyne cycloaddition (“click reaction”). We used these surfaces to capture polyA⁺ RNA from cell extracts, which were then 3'-labeled with Cy3-dATP. We then used TIRF microscopy to register individual RNAs (Cy3 signal) and detect m⁶A-modified RNAs with a combination of m⁶A antibody and AF647-conjugated secondary antibody (Figure 1A). We extensively validated the sensitivity and linearity of our detection platform by using synthetic transcripts and 2× polyA⁺ RNA prepared from K562 cells deficient for either the m⁶A methyltransferase (*METTL3*-knockout [*METTL3*-KO]) or the cap-specific m⁶Am methyltransferase (*PCIF1*-KO) (Figures 1B–1E and S1; STAR Methods) (Boulias et al., 2019; Lin et al., 2016; Sendinc et al., 2019). Although the m⁶A antibody also recognizes the structurally similar N⁶, 2'-O-dimethyladenosine (m⁶Am) modification (Linder et al., 2015; Wei et al., 1975), our data indicate that this cap-specific modification contributes minimally to signal detected by our single-molecule assay in this system. Specifically, we find that *PCIF1*-KO leads to a minimal (~5%) reduction in the fraction of 2× polyA⁺ RNA transcripts with detected m⁶A, in relation to wild-type (WT) K562

cells (Figures S1B and S1C). In contrast, *METTL3*-KO leads to a much more significant reduction (~75%). The remaining 25% signal might reflect incomplete deletion of *METTL3* in the cell line. Furthermore, liquid chromatography-tandem mass spectrometry (LC-MS/MS) analysis of absolute m⁶A and m⁶Am levels for 2× polyA⁺ RNA isolated from K562 (or YAC1) cells indicated that m⁶A is ~20-fold more prevalent than m⁶Am, consistent with prior studies (Figure S1E) (Boulias et al., 2019; Molinie et al., 2016; Sendinc et al., 2019). The specificity of our assay for m⁶A-modified transcripts might reflect the fact that only 3' polyA⁺ transcripts are captured and analyzed (Zhao et al., 2014), as well as the lower ratio of m⁶Am to m⁶A in our cell models.

Next, to identify modified and unmodified mRNA transcripts, we adapted single-molecule sequencing-by-synthesis methods (Ozsolak et al., 2009). We reverse transcribed the mRNA transcripts with oligo-dT primers to synthesize first-strand cDNA, digested excess primers with Exo I, and then used terminal transferase to append polyG tails to the 3' ends of the cDNAs. We then sequenced the single molecules by using oligo dC₁₅ primers and stepwise addition of fluorescent reversible terminator nucleotides (Figure 1A).

We first applied this procedure to mRNA isolated from 1,000 GM12878 cells, detecting m⁶A-modified and -unmodified mRNAs and sequencing corresponding cDNAs. We acquired a total of 0.5M sequencing reads, 27% of which were m⁶A modified (0.14M reads). This enabled us to directly quantify individual gene transcripts on the basis of mRNA counts, and to evaluate their m⁶A modification levels on the basis of the fraction that scored as m⁶A modified (Table S1). Biological replicates were highly concordant in terms of gene transcript levels ($R = 0.97$) and m⁶A-modified proportions ($R = 0.92$; Figures S1F–S1H). We also directly compared our data from 1,000 GM12878 cells against published data generated for 10 million GM12878 cells by using an m⁶A antibody immunoprecipitation (m⁶A-LAIC-seq) (Molinie et al., 2016). Despite the orthogonality of the assays, we found the datasets to be well correlated (whole transcriptome $R = 0.65$, m⁶A levels $R = 0.50$; Figures 1E, 1F, S1I, and S1J). Gene Ontology analysis of the data derived from our platform confirmed that transcriptional regulators are enriched among m⁶A-modified transcripts, whereas transcripts encoding translational regulators tend to have low levels of this modification (Molinie et al., 2016; Wang et al., 2019; Zhou et al., 2019) (Figure S1K). Altogether, these results demonstrate that our direct m⁶A detection and single-molecule sequencing can enable m⁶A profiling from very low numbers of cells with high specificity, sensitivity, and reproducibility.

We next extended our platform to quantify transcripts and m⁶A levels for single cells (Figure 2A). We designed an array with 47,368 subnanoliter wells (0.6 nL per well). We reasoned that the physical isolation of single cells into each nanowell would facilitate imaging of multiple modalities from the same single cell, both before and after cell lysis. We loaded a mixture of K562 (human) and YAC1 (mouse) cells stained with SYTO9 and SYTO87, respectively, into the wells by using gravity. The cell preparation was diluted such that most wells were loaded with a single cell. We scanned the loaded array with multicolor fluorescence imaging (5× magnification) to enable counting and

phenotyping of cells prior to lysis (Figure 2A, Nanowell Scan). We then converted the x/y coordinates of each nanowell along with the number of loaded cells from the fluorescence image into a cell occupancy matrix (COM) for the array. This step facilitates cell phenotyping without sorting (Figure 2B), and acts as a quality control by measuring cell density in the array.

Next, we added lysis solution to the nanowells, and sealed the array with an oligo-dT-coated coverslip with the surface chemistry described above (Figures S2A and S2B). We incubated the assembly to capture polyA⁺ RNAs, and assembled a flow cell (Figure 2A; STAR Methods). We detected bound RNA molecules and m⁶A by imaging each surface area of 15,400 μm² for individual nanowells using TIRF microscopy (60× magnification), as detailed above and in Figure 1 (STAR Methods). The images revealed a grid-like pattern with multiple squares with high RNA signal density separated by thin frames without signal. Alignment of the TIRF image to the lower-resolution fluorescent scan allowed us to register the TIRF squares to 1,581 individual nanowells (Figures S2C and S2D). We then implemented a custom algorithm to quantify polyA⁺ RNAs and m⁶A in each nanowell and converted this information into an RNA density matrix (RDM) of transcript abundance and m⁶A modification levels for individual cells (Figure 2A, Flow Cell Scan). Nanowells with zero cells or with more than one cell were excluded from further analysis.

The matrix registration between COM and RDM enabled us to link the cellular phenotype (green/K562 and red/YAC1, Figure S2E) to the molecular readouts for each single cell. We found that K562 cells contain ~2-fold greater transcript abundance and ~2-fold higher m⁶A levels compared with YAC1 cells (Figures 2C–2E). Similar trends of higher m⁶A levels in K562 cells were confirmed by traditional dot blot assay (Figure S2F) and high-sensitivity mass spectrometry (LC-MS/MS; Figure S1E). We conclude that the nanowell version of our platform enables quantification of m⁶A-modified RNAs and multicolor phenotyping of the same sample on a single-cell level.

To demonstrate the utility of our platform for measuring immunophenotypes, we cultured human acute myeloid leukemia cells (MUTZ3) in media conditions that induced partial differentiation. We then incubated the cells with a nuclear stain (SYTO9) and antibodies against CD34, a surface marker of leukemic progenitors, and CD14, a marker of myeloid differentiation (Vu et al., 2017; Weng et al., 2018) (Figures 2F and 2G). We loaded labeled MUTZ3 cells into the nanowell array and used our platform to assign an immunophenotype, as well as quantifying total polyA⁺ RNAs and m⁶A-modified RNAs in each single cell (Figures 2H–2J). Similar to previous reports on bulk populations of cells, we find that primitive CD34⁺, CD14[−] MUTZ3 cells contain 40% less polyA⁺ RNAs but 3 times more m⁶A-modified RNAs than differentiated CD34[−], CD14⁺ cells (Vu et al., 2017; Weng et al., 2018). Again, we confirmed m⁶A levels by fluorescence-activated cell sorting (FACS) using CD14/CD34 gates and by m⁶A dot blot (Figure S2G). These data demonstrate that our platform can jointly assign an immunophenotype and quantify m⁶A-modified RNA transcripts in the same single cells, without cell sorting.

We next sought to apply the platform to quantify surface markers, m⁶A levels, and gene expression signatures in the same single cells (Figure 3). To quantify transcripts on our single-molecule surfaces, we implemented a seqFISH

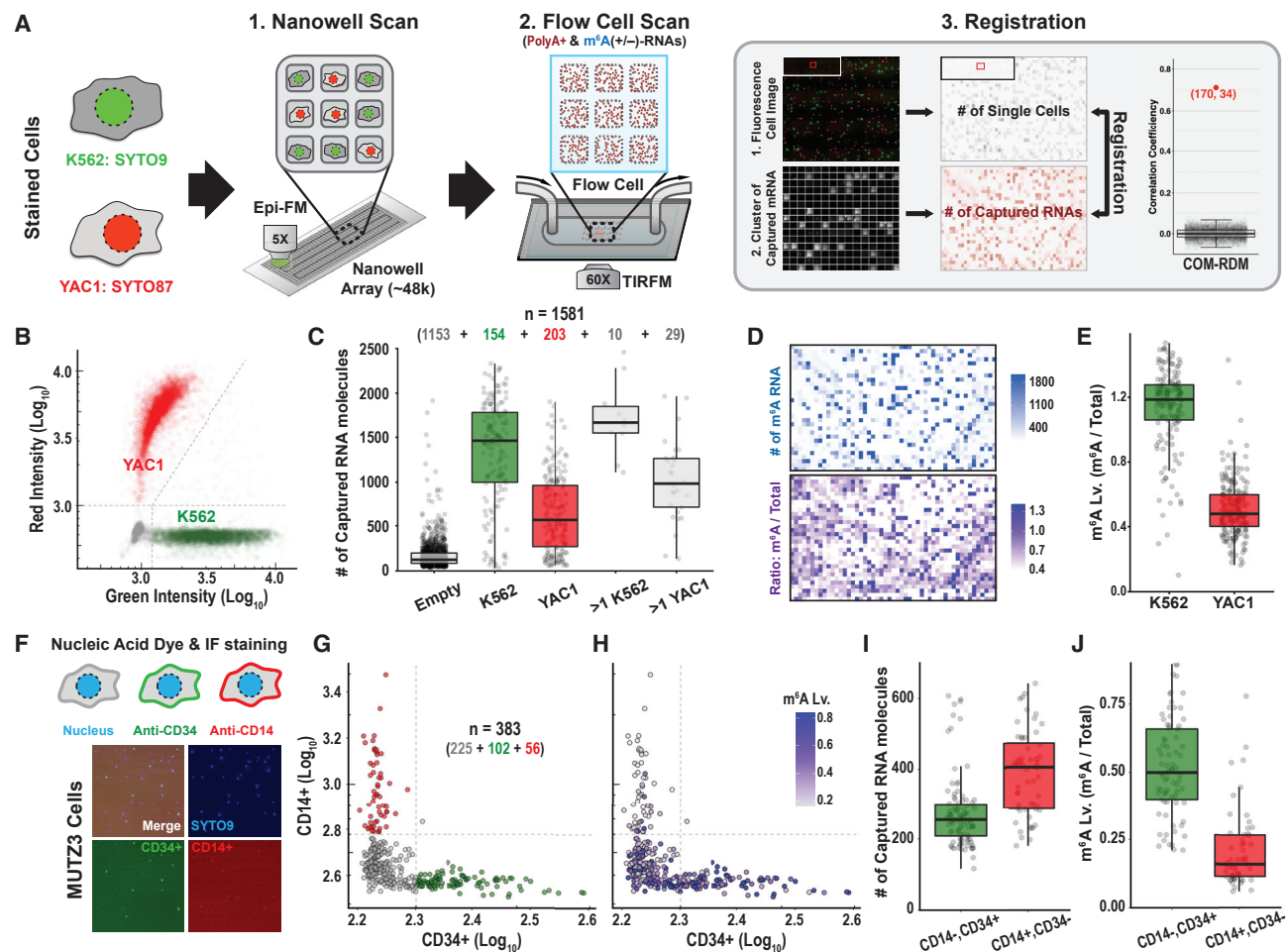


Figure 2. A platform for single-cell m^6A level measurement

(A) Workflow of m^6A detection from single-cell transcriptomes. (1) Fluorescence dye-stained cells (K562, SYTO9 [green]; YAC1, SYTO87 [red]) were allowed to settle into the wells of a nanowell plate by gravity. The plate was scanned by epifluorescence microscopy to count and phenotype cells prior to lysis. (2) After cell lysis, the nanowell plate was immediately sealed with an oligo-dT-coated coverslip to capture polyA⁺ RNAs confined in each well. A flow cell was assembled with the detached coverslip. Captured polyA⁺ RNA molecules were labeled with Cy3-dATP by using Klenow *exo*-. m^6A -modified RNA molecules were detected as described in Figure 1A. The flow cell was scanned by using TIRF microscopy to measure the amounts of captured polyA⁺ RNA and m^6A -modified RNA molecules. (3) The nanowell and flow cell scanning images were used to generate a COM and single-molecule density matrix of captured RNA (RDM), respectively. Occupied wells were registered by finding the outlier of correlation coefficient between the matrices.

(B) Scatterplot of single-cell fluorescence intensity from nanowell scanning images with K562 (green) and YAC1 (red) cells.

(C) Box plots depicting the number of captured polyA⁺ RNA molecules per imaging area ($15,400 \mu\text{m}^2$). Number of imaging areas is indicated above box plots.

(D) Matrices of single-molecule density of m^6A -modified polyA⁺ RNA (top) and the ratio of m^6A -modified polyA⁺ RNA to total polyA⁺ RNA molecules (bottom).

(E) Box plots showing m^6A levels for K562 and YAC1 cells.

(F) Representative fluorescence images of nanowells occupied with MUTZ3 cells stained with SYTO9 (blue), anti-CD14 (red), and anti-CD34 (green).

(G and H) Scatterplot of single-cell fluorescence intensity (G) from nanowell scanning images of stained MUTZ3 cells. Each cell was colored by corresponding m^6A level (H).

(I and J) Box plots showing the number of captured polyA⁺ RNA molecules (I) and m^6A levels (J) in CD14⁻CD34⁺ and CD14⁺CD34⁻ cell populations.

See also Figure S2.

(Eng et al., 2017). We applied a mixture of pre-stained K562 (SYTO9; green) and GM12878 (SYTO87; red) onto the nanowell array (Figures 3A and 3B). We proceeded through the steps detailed above to query surface marker expression, to lyse the cells, to quantify polyA⁺ RNAs, and to quantify m^6A -modified RNAs in each single cell. Next, we hybridized an OligoPool of 222 primary probes targeting the coding regions of 9 mRNAs

(18–30 probes per gene) to the flow cell. To quantify absolute counts for each targeted transcript, we sequentially hybridized secondary probes, removing the fluorophores between rounds by disulfide cleavage (Figures 3A and 3B and Table S2).

We acquired high-quality surface marker data, m^6A levels, and gene expression signatures for 111 single cells. We performed unsupervised clustering on the gene expression signatures to

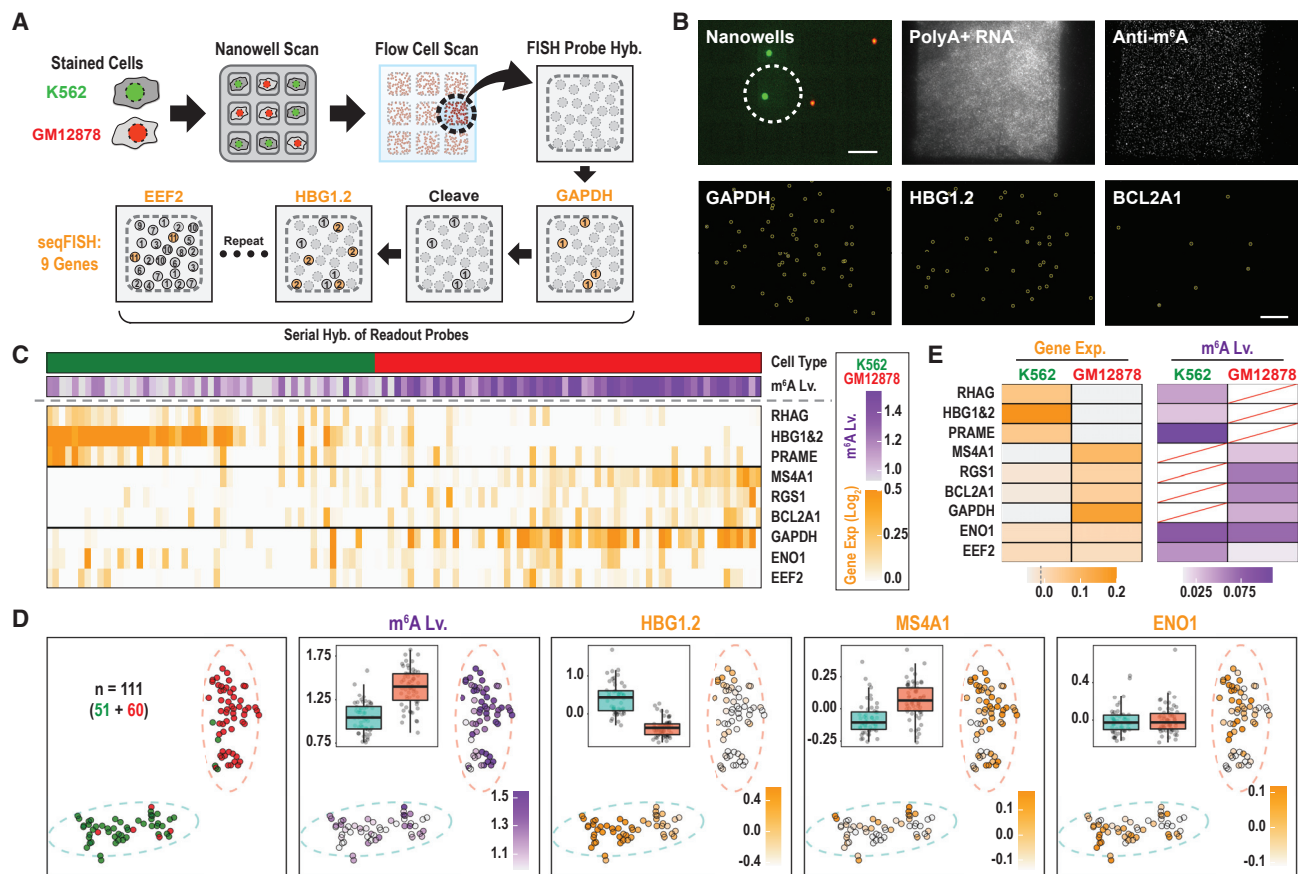


Figure 3. Application of seqFISH on the single-cell m⁶A assay

(A) Experimental workflow. A mixture of K562 (SYTO9, green) and GM12878 (SYTO87, red) cells was applied to the nanowell plate. The nanowell plate and flow cell were scanned, as described in Figure 2A. Gene-specific primary probes were hybridized to nine targeted mRNAs. To quantify each targeted transcript, we sequentially hybridized secondary readout probes, removing the fluorophores between rounds by disulfide cleavage.

(B) Top left: representative nanowell scan. Scale bar, 100 μ m. Remaining images show polyA+ RNA; m⁶A-modified RNA; and seqFISH for GAPDH, HBG1 and 2, and BCL2A1 from a single well. Scale bar, 20 μ m.

(C) Heatmap showing m⁶A levels and relative expression levels of nine target genes at a single-cell level in K562 (green) and GM12878 (red) cells.

(D) tSNE visualization of 48 qualified single-cell seqFISH profiles. Dashed circles indicate clusters (subpopulations). Single cells are colored according to cell type on the nanowell array (green or red), m⁶A level (purple), or relative gene expression levels (orange). Box plots show the m⁶A level (m⁶A/total transcripts) or log-mean gene expression levels among clusters.

(E) Heatmap of gene expression levels and gene-specific m⁶A levels in K562 and GM12878 cells. Red diagonal lines represent "not applicable" values with log-mean gene expression levels less than -0.02.

See also Figure S3 and Table S2.

distinguish cells types, validating the clusters by surface marker status. The seqFISH data enabled us to confidently assign each cell as K562 or GM12878 (Figures 3C, 3D, and S3A). This allowed us to compare m⁶A levels at the single-cell level, which revealed higher transcript abundance but lower m⁶A levels in the K562 cells, consistent with our initial bulk analysis (Figures S3B and S3D).

Finally, we sought to couple m⁶A detection and seqFISH to quantify m⁶A levels on known transcripts in single cells (Figures 3E and S3E). In the 36 single cells with successful image alignment between m⁶A detection and seqFISH, we found that 436 out of 8,837 transcripts for 9 genes were modified. Quantification of m⁶A levels at the resolution of single genes is well correlated between our bulk and single-cell experiments ($R = 0.48$; Fig-

ure S3F). It is worth noting that, because of the nature of single-cell data, reproducible measurements of m⁶A on single transcripts from single cells are only feasible in transcripts expressed over a certain threshold (Figures S3G–S3I; STAR methods). Altogether, these experiments provide a proof of principle that our platform is able to profile cell surface markers, and to quantify both transcripts and their m⁶A levels, all from the same single cell.

DISCUSSION

In summary, we have established an open source platform for multi-modal single-cell assays. At the bulk level, we demonstrated transcriptome-wide profiling and quantification of

RNA modifications from low-input samples (<1,000 cells). At the single-cell level, the nanowell adaptation enabled simultaneous quantification of cell surface markers, total polyA⁺ RNA content, RNA modifications, and absolute numbers of individual transcripts, from the same single cells. Direct imaging and image registration between the cellular phenotyping and molecular imaging steps abrogates the need for cellular barcodes, obviating laborious library preparation steps. The open source nature and flexibility of our platform also lends itself to the future addition of other modalities, such as antibody probes (Figures S3J–S3K) and chemical detection of other RNA modifications (Li et al., 2015). This could enable investigation of combinatorial RNA modifications (“code”) or charting biophysical properties of RNA-binding proteins (Meyer, 2019). We expect that future versions of the nanowell technology will enable RNA density optimization, and further integration with single-molecule sequencing methods (i.e., LQ-DGE) will increase the transcriptome-wide throughput and enable the measurements of individual isoforms and allelic expression (Wang et al., 2009). In conclusion, we present an effective and flexible platform for the measurement of epigenetic modification of mRNAs, transcript abundance, and surface proteins at the single-molecule and single-cell levels.

Limitations

Our current procedure for detecting RNA modifications on single molecules favors binary interpretation of the presence or absence of the modification over stoichiometry of the modification sites in a transcript. Regardless of the number of m⁶A-modified sites in a transcript, the fluorescence signal from antibody detections is converted to m⁶A-positive transcripts during processing of the single-molecule image. As a result, our assay classifies transcripts as unmodified or as containing one or more modifications. Going forward, quantitative measurements of modification sites in a transcript might be accomplished by labeling modified bases enzymatically with fluorescence dye (Shu et al., 2020; Wang et al., 2020) or fluorescently tagged modification-specific RNA-binding protein (Ries et al., 2019), followed by stoichiometric measurements by single-molecule photobleaching (Ulbrich and Isacoff, 2007). An additional issue relates to cross-reactivity of the m⁶A antibody with the cap-specific m⁶Am modification (Linder et al., 2015). Although our controls suggest that m⁶Am contributes minimally to the detected signal in our experimental system (Figures S1B–S1E), this cross-reactivity could confound interpretation of data from other systems. Therefore, we recommend complementing analysis of the single-cell data with assays such as m⁶Am-exo sequencing (Boulias et al., 2019), DART sequencing (Meyer, 2019), and/or liquid chromatography-mass spectrometry (LC-MS) analysis.

STAR★METHODS

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SUPPLEMENTAL INFORMATION

Supplemental information can be found online at <https://doi.org/10.1016/j.crmeth.2021.100061>.

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AUTHOR CONTRIBUTIONS

K.L.K., E.S., and B.E.B. developed the concepts and designed the study. K.L.K., G.J.R., and E.N.A. performed the experiments. K.L.K., P.v.G., and V.H. performed bioinformatic analysis. A.S. and D.R.J. helped design and perform the single-molecule sequencing experiments. K.L.K., E.G., E.S., and B.E.B. wrote the manuscript with feedback from all authors. B.E.B. supervised the project.

DECLARATION OF INTERESTS

B.E.B. declares outside interests in Fulcrum Therapeutics, HiFiBio, Arsenal Biosciences, Cell Signaling Technologies, and Chroma Medicine. D.R.J. declares interest in SeqLL as founding and current chief executive officer and director.

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REFERENCES

Beliveau, B.J., Kishi, J.Y., Nir, G., Sasaki, H.M., Saka, S.K., Nguyen, S.C., Wu, C.-T., and Yin, P. (2018). OligoMiner provides a rapid, flexible environment for the design of genome-scale oligonucleotide in situ hybridization probes. *Proc. Natl. Acad. Sci. U S A* 115, E2183–E2192.

- Boulias, K., Toczyłowska-Socha, D., Hawley, B.R., Liberman, N., Takashima, K., Zaccara, S., Guez, T., Vasseur, J.-J., Debart, F., Aravind, L., et al. (2019). Identification of the m6Am methyltransferase PCIF1 reveals the location and functions of mAm in the transcriptome. *Mol. Cell* 75, 631–643.e8.
- Brown, L.G. (1992). A survey of image registration techniques. *ACM Comput. Surv.* 24, 325–376.
- Dominissini, D., Moshitch-Moshkovitz, S., Schwartz, S., Salmon-Divon, M., Ungar, L., Osenberg, S., Cesarkas, K., Jacob-Hirsch, J., Amariglio, N., Kupiec, M., et al. (2012). Topology of the human and mouse m6A RNA methylomes revealed by m6A-seq. *Nature* 485, 201–206.
- Eng, C.-H.L., Shah, S., Thomassie, J., and Cai, L. (2017). Profiling the transcriptome with RNA SPOTs. *Nat. Methods* 14, 1153–1155.
- Frye, M., Harada, B.T., Behm, M., and He, C. (2018). RNA modifications modulate gene expression during development. *Science* 361, 1346–1349.
- Garcia-Campos, M.A., Edelheit, S., Toth, U., Safra, M., Shachar, R., Viukov, S., Winkler, R., Nir, R., Lasman, L., Brandis, A., et al. (2019). Deciphering the “m6A code” via antibody-independent quantitative profiling. *Cell* 178, 731–747.e16.
- Gierahn, T.M., Wadsworth, M.H., 2nd, Hughes, T.K., Bryson, B.D., Butler, A., Satija, R., Fortune, S., Love, J.C., and Shalek, A.K. (2017). Seq-Well: portable, low-cost RNA sequencing of single cells at high throughput. *Nat. Methods* 14, 395–398.
- Kim, K.L., Park, K.M., Murray, J., Kim, K., and Ryu, S.H. (2018). Direct profiling the post-translational modification codes of a single protein immobilized on a surface using Cu-free click chemistry. *ACS Cent. Sci.* 4, 614–623.
- Li, X., Zhu, P., Ma, S., Song, J., Bai, J., Sun, F., and Yi, C. (2015). Chemical pull-down reveals dynamic pseudouridylation of the mammalian transcriptome. *Nat. Chem. Biol.* 11, 592–597.
- Lin, S., Choe, J., Du, P., Triboulet, R., and Gregory, R.I. (2016). The m(6)A methyltransferase METTL3 promotes translation in human cancer cells. *Mol. Cell* 62, 335–345.
- Linder, B., Grozhik, A.V., Olariu-George, A.O., Meydan, C., Mason, C.E., and Jaffrey, S.R. (2015). Single-nucleotide-resolution mapping of m6A and m6Am throughout the transcriptome. *Nat. Methods* 12, 767–772.
- Meyer, K.D. (2019). DART-seq: an antibody-free method for global m⁶A detection. *Nat. Methods* 16, 1275–1280.
- Meyer, K.D., Saletore, Y., Zumbo, P., Elemento, O., Mason, C.E., and Jaffrey, S.R. (2012). Comprehensive analysis of mRNA methylation reveals enrichment in 3' UTRs and near stop codons. *Cell* 149, 1635–1646.
- Molinie, B., Wang, J., Lim, K.S., Hillebrand, R., Lu, Z.-X., Van Wittenberghe, N., Howard, B.D., Daneshvar, K., Mullen, A.C., Dedon, P., et al. (2016). m(6)A-LAIC-seq reveals the census and complexity of the m(6)A epitranscriptome. *Nat. Methods* 13, 692–698.
- Ozsolak, F., Platt, A.R., Jones, D.R., Reifemberger, J.G., Sass, L.E., McInerney, P., Thompson, J.F., Bowers, J., Jarosz, M., and Milos, P.M. (2009). Direct RNA sequencing. *Nature* 461, 814–818.
- Ozsolak, F., Ting, D.T., Wittner, B.S., Brannigan, B.W., Paul, S., Bardeesy, N., Ramaswamy, S., Milos, P.M., and Haber, D.A. (2010). Amplification-free digital gene expression profiling from minute cell quantities. *Nat. Methods* 7, 619–621.
- Ries, R.J., Zaccara, S., Klein, P., Olariu-George, A., Namkoong, S., Pickering, B.F., Patil, D.P., Kwak, H., Lee, J.H., and Jaffrey, S.R. (2019). m⁶A enhances the phase separation potential of mRNA. *Nature* 571, 424–428.
- Sendinc, E., Valle-Garcia, D., Dhall, A., Chen, H., Henriques, T., Navarrete-Perea, J., Sheng, W., Gygi, S.P., Adelman, K., and Shi, Y. (2019). PCIF1 catalyzes m6Am mRNA methylation to regulate gene expression. *Mol. Cell* 75, 620–630.e9.
- Shu, X., Cao, J., Cheng, M., Xiang, S., Gao, M., Li, T., Ying, X., Wang, F., Yue, Y., Lu, Z., et al. (2020). A metabolic labeling method detects m⁶A transcriptome-wide at single base resolution. *Nat. Chem. Biol.* 16, 887–895.
- Ulbrich, M.H., and Isacoff, E.Y. (2007). Subunit counting in membrane-bound proteins. *Nat. Methods* 4, 319–321.
- Wang, Y., Xiao, Y., Dong, S., Yu, Q., and Jia, G. (2020). Antibody-free enzyme-assisted chemical approach for detection of N⁶-methyladenosine. *Nat. Chem. Biol.* 16, 896–903.
- Wang, Y., Zheng, Y., Guo, D., Zhang, X., Guo, S., Hui, T., Yue, C., Sun, J., Guo, S., Bai, Z., et al. (2019). m6A methylation analysis of differentially expressed genes in skin tissues of coarse and fine type Liaoning cashmere goats. *Front. Genet.* 10, 1318.
- Vu, L.P., Pickering, B.F., Cheng, Y., Zaccara, S., Nguyen, D., Minuesa, G., Chou, T., Chow, A., Saletore, Y., MacKay, M., et al. (2017). The N⁶-methyladenosine (m⁶A)-forming enzyme METTL3 controls myeloid differentiation of normal hematopoietic and leukemia cells. *Nat. Med.* 23, 1369–1376.
- Wang, Z., Gerstein, M., and Snyder, M. (2009). RNA-Seq: a revolutionary tool for transcriptomics. *Nat. Rev. Genet.* 10, 57–63.
- Wei, C., Gershowitz, A., and Moss, B. (1975). N⁶, O²'-dimethyladenosine a novel methylated ribonucleoside next to the 5' terminal of animal cell and virus mRNAs. *Nature* 257, 251–253.
- Weng, H., Huang, H., Wu, H., Qin, X., Zhao, B.S., Dong, L., Shi, H., Skibbe, J., Shen, C., Hu, C., et al. (2018). METTL14 inhibits hematopoietic stem/progenitor differentiation and promotes leukemogenesis via mRNA m⁶A modification. *Cell Stem Cell* 22, 191–205.e9.
- Yang, Y., Hsu, P.J., Chen, Y.-S., and Yang, Y.-G. (2018). Dynamic transcriptomic m6A decoration: writers, erasers, readers and functions in RNA metabolism. *Cell Res.* 28, 616–624.
- Zhao, W., He, X., Hoadley, K.A., Parker, J.S., Hayes, D.N., and Perou, C.M. (2014). Comparison of RNA-seq by poly (A) capture, ribosomal RNA depletion, and DNA microarray for expression profiling. *BMC Genomics* 15, 419.
- Zhou, L., Tian, S., and Qin, G. (2019). RNA methylomes reveal the m⁶A-mediated regulation of DNA demethylase gene SIDML2 in tomato fruit ripening. *Genome Biol.* 20, 156.

STAR★METHODS

KEY RESOURCES TABLE

Reagent or Resource	Source	Identifier
Antibodies		
Rabbit, Anti-N6-methyladenosine antibody	Cell Signaling Technology	Cat# 15000BC
Anti-rabbit IgG, HRP-linked antibody	Cell Signaling Technology	Cat# 7074S; RRID: AB_2099233
Mouse, Anti-CD14 antibody, RMO52	Beckman Coulter	Cat# IM0643
Monoclonal mouse, Anti-CD34 antibody, clone 8G12	BD Biosciences	Cat# 348050; RRID: AB_400369
Goat anti-Mouse IgG1 Cross-Adsorbed Secondary Antibody, Alexa Fluor 546	ThermoFisher	Cat# A-21123; RRID: AB_2535765
Goat anti-Mouse IgG2a Cross-Adsorbed Secondary Antibody, Alexa Fluor 647	ThermoFisher	Cat# A-21241; RRID: AB_2535810
Goat anti-Rabbit IgG (H+L) Cross-Adsorbed Secondary Antibody, APC	ThermoFisher	Cat# A-10931; RRID: AB_2534068
Rabbit anti-PCIF1 Antibody	Bethyl Laboratories	Cat# A304-711A; RRID: AB_2620906
Rabbit anti-METTL3/MT-A70 Antibody	Bethyl Laboratories	Cat# A301-567A; RRID: AB_1040004
Chemicals, peptides, and recombinant proteins		
3-(2-aminoethylamino)-propyltrimethoxysilane	Tokyo Chemical Industry Co.	Cat# A0774
Acetic acid	Sigma	Cat# A6283
Azide PEG Succinimidyl Carboxymethyl Ester	JenKem Technology USA Inc.	Cat# A5088-1
Dimethyl sulfoxide, anhydrous, ≥99.9%	Sigma	Cat# 276855
Triethylamine	Sigma	Cat# 471283
Copper(II) sulfate pentahydrate	Sigma	Cat# 209198
Tris-hydroxypropyltriazolylmethylamine (THPTA)	Click Chemistry Tools	Cat# 1010-100
Sodium ascorbate	Sigma	Cat# A4034
N6-methyladenosine-5'-triphosphate	TriLink	Cat# N1013
1 M MgCl ₂	Sigma	Cat# 63069-100ML
1 M Tris-HCl pH 8.0	Boston BioProducts	Cat# BBT-80
10 mM dNTPs	New England BioLabs	Cat# N0447L
BSA	Sigma	Cat# A9418-100G
RNase Inhibitor	Thermo Fisher	Cat# AM2696
Tween-20	Fisher Scientific	Cat# 65-520-4100ML
UltraPure™ 0.5M EDTA, pH 8.0	Invitrogen	Cat# 15575020
Sodium Chloride	Fisher Chemical	Cat# S671-3
Potassium hydroxide	Sigma	Cat# P5958
10% NP-40	Abcam	Cat# ab142227
pCp-Cy3	Jena Bioscience	Cat# NU-1706-CY3
Protocatechuate 3,4-Dioxygenase	Sigma	Cat# P8279-25UN
Protocatechuic acid	Sigma	Cat# P5630
Trolox	Sigma	Cat# 238813
Amersham Hybond-XL	Cytiva	Cat# RPN303s
Cyanine 3-dATP	PerkinElmer	Cat# NEL592001EA
1X ThermoPol buffer	New England BioLabs	Cat# B9004S
Virtual terminator dNTP analogs	SeqLL	N/A
Adenosine	Toronto Research Chemicals	Cat# A280400
2'-Deoxyadenosine Monohydrate	Toronto Research Chemicals	Cat# D231620
N6-Methyladenosine	Toronto Research Chemicals	Cat# M275895
N6,O2'-Dimethyladenosine	Toronto Research Chemicals	Cat# D447415

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Reagent or Resource	Source	Identifier
Hoechst 33342	Invitrogen	Cat# 62249
SYTO9	Invitrogen	Cat# S34854
SYTO87	Invitrogen	Cat# S11363
Hybridization Chamber Kit - SureHyb enabled	Agilent	Cat# G2534A
FluoSphere beads	Thermo Fischer	Cat# F8807
Azido-PEG3-SS-NHS	Conju Probe	Cat# CP-2060
AFDye 647 DBCO	Click Chemistry Tools	Cat# 1302-1
Azide Magnetic Beads	Click Chemistry Tools	Cat# 1036-1
20X SSC	Thermo Fischer	Cat# 15557036
Formamide	Sigma	Cat# F9037
Dextran Sulfate	Sigma	Cat# D8906; D4911
TCEP	Sigma	Cat# 646547

Critical commercial assays

HiScribe™ T7 Quick High Yield RNA Synthesis Kit	New England BioLabs	Cat# E2050
RNAClean XP Kit	Beckman Coulter	Cat# A66514
<i>E. coli</i> Poly(A) Polymerase	New England BioLabs	Cat# M0276
T4 RNA Ligase 1	New England BioLabs	Cat# M0204
Dynabeads mRNA DIRECT Purification Kit	Invitrogen	Cat# 61011
Pierce™ ECL Western Blotting Substrate	Thermo Fisher	Cat# 32106
RNeasy Mini Kit	QIAGEN	Cat# 74104
Klenow Fragment (3' → 5' exo-)	New England BioLabs	Cat# M0212S
Proteinase K	New England BioLabs	Cat# P8107S
SuperScript III Reverse Transcriptase	Invitrogen	Cat# 18080093
Exonuclease I	New England BioLabs	Cat# M0293S
Terminal Transferase	New England BioLabs	Cat# M0315S
RppH	New England BioLabs	Cat# M0356S
RNA Clean and Concentrator-5 Kit	Zymo Research	Cat# R1013
Nuclease P1	New England BioLabs	Cat# M0660
Shrimp Alkaline Phosphatase	New England BioLabs	Cat# M3071S
YM-10 centrifugal spin column	Millipore	Cat# MRCPR010
Illustra NAP-5 columns	GE Healthcare	Cat# 17-0853-01

Deposited Data

m ⁶ A-LAIC-seq	Molinie et al., 2016	GSE66086
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Experimental models: Cell lines

K562	ATCC	Cat# CCL-243
YAC1	ATCC	Cat# TIB-160
GM12878	Coriell	Cat# GM12878
MUTZ3	DSMZ	Cat# ACC-295
5637	ATCC	Cat# HTB-9

Oligonucleotides

<i>in vitro</i> -generated transcripts (IVTs)	Integrated DNA Technologies	5'-GGCCAGTGAATTGTAATACGACTC ACTATAGGGAGGCGGTAAACACCTTC TGGACTCTTCATAGAGTTGGTCTATT TGTCTCCAGCTGCCAGTTGTTGT GGCCTGTTTTCGGGCGTCTGCGGC GAAGATCTTGTGTCAGAGCCTTAGG TGTATCTAGATTGTGATCCCCTTCC TCACTTGGTAGTCTGTGCGACTT-3'
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Reagent or Resource	Source	Identifier
Hexynyl-Oligo dT50	Integrated DNA Technologies	5'Hexynyl-TTTTTTTTTTTTTTTTTTTTTT TTTTTTTTTTTTTTTTTTTTTTTTTTT-3'
Synthetic RNA fragments	Integrated DNA Technologies	rArC-rX-rUrG, X=A, m6A, U or ψ
METTL3 gRNA_1	Integrated DNA Technologies	5'-ATCATTCCGGACAGGCCGTAC-3'
METTL3 gRNA_2	Integrated DNA Technologies	5'-GCTCAACATACCCGCTACTAC-3'
PCIF1 gRNA_1	Integrated DNA Technologies	5'-GATCCGTTTGACGTACTCCA -3'
PCIF1 gRNA_2	Integrated DNA Technologies	5'-ACTTAACATATCCTGCGGGG-3'
Control gRNA_1	Integrated DNA Technologies	5'-ACGGAGGCTAAGCGTCGCAA-3'
Control gRNA_2	Integrated DNA Technologies	5'-CGCTTCCGCGGCCCGTTCAA-3'
seqFISH probes	Integrated DNA Technologies	See the Table S2
Recombinant DNA		
pGIR-PB-U6-NT1(H.s)-CMV-Cas9-T2a-eGFP	Table S3	N/A
pGIR-PB-U6-NT2(H.s)-CMV-Cas9-T2a-eGFP	Table S3	N/A
pGIR-PB-U6-METTL3-gRNA1-CMV-Cas9-T2a-eGFP	Table S3	N/A
pGIR-PB-U6-METTL3-gRNA2-CMV-Cas9-T2a-eGFP	Table S3	N/A
pGIR-PB-U6-PCIF1-gRNA1-CMV-Cas9-T2a-eGFP	Table S3	N/A
pGIR-PB-U6-PCIF1-gRNA2-CMV-Cas9-T2a-eGFP	Table S3	N/A
Software and algorithms		
Scripts used for image processing and single-cell analysis	This paper	https://github.com/Kim-KL/scRNAmold
R version 3.4	R Core Team	https://www.r-project.org
ImageJ 1.46 r	NIH	https://imagej.nih.gov/ij/

RESOURCE AVAILABILITY

Lead contact

Further information and requests for resources and reagents should be directed to and will be fulfilled by the Lead Contact, Bradley E. Bernstein (Bradley_Bernstein@DFCI.HARVARD.EDU).

Materials availability

Plasmids generated in this study are available upon request.

Data and code availability

The custom scripts generated during this study are available on GitHub (<https://github.com/Kim-KL/scRNAmold>).

EXPERIMENTAL MODEL AND SUBJECT DETAILS

K562 and YAC1 cells (ATCC) were cultured using RPMI 1640 medium (Gibco, Cat. #61870036) supplemented with 10% heat-inactivated fetal bovine serum (FBS). GM12878 cells were cultured using RPMI 1640 medium (Gibco, Cat. #61870036) supplemented with GlutaMax and 15% FBS. MUTZ3 cells were cultured using MEM alpha (Thermo, Cat. #12571-063) with 20% FBS and 10% 5637-conditioned medium. All cells were maintained at 37°C in a humidified CO₂-controlled (5%) incubator.

5637 cells were cultured using RPMI 1640 medium supplemented with 10% FBS until 95% confluence. The culture medium was collected from the culture dish and centrifuged for 10 minutes at 1,200 rpm and filtered through a 0.2-μm Millipore filter. This conditioned medium retained its potency for a couple of weeks when stored at 4°C or for several months when stored at -20°C.

METHOD DETAILS

Preparation of oligo dT surface

Coverslips were functionalized as previously described (Kim et al., 2018) with some modifications. Briefly, extensively cleaned coverslips were prepared by washing with ultrapure water and 1 M KOH for at least 2 h, and then were treated with 1.5% 3-(2-aminoethylamino)-propyltrimethoxysilane (Tokyo Chemical Industry Co., Cat. #A0774) in ethanol solution with 5% (v/v) acetic acid for 20 min at room temperature. After triple rinsing with ethanol, the coverslips were dried and doped with 100 mg/mL azide-PEG (JemKem Technology USA, Cat. #A5088-1) in anhydrous DMSO solution with 0.1% (v/v) triethylamine for at least 2 h at room

temperature. After extensive rinsing with ultrapure water, the passivated coverslips were dried and stored in a vacuum desiccator until oligo deposition. The coverslips were doped with Hexynyl-Oligo dT50 in 0.1 M sodium bicarbonate buffer with 2 mM CuSO₄, 2mM THPTA, and 4 mM sodium ascorbate for 1 h at room temperature and then extensively washed with ultrapure water and kept in T50 buffer (10 mM Tris-HCl pH 8.0, 50 mM NaCl, 0.05% Tween-20) until the next step.

Anti-m⁶A antibody validation

To validate the anti-m⁶A antibody, we used *in vitro*-generated transcripts (IVTs) from a DNA oligo of random sequence: (T7 promoter) 5'-GGCCAGTGAATTGTAATACGACTC-ACTATAGGGAGGCGGTAACACCTTCTGGACTCTTCATAGAGTTGGTCTATTTGTCTCCACGCTGCCAGGTTGTTGTGGCCTGTTTTCGGGCGTCTGCGGCGAAGATCTCTTGTGTCAGAGCCTTAGGTGTATCTAGATTGTGATCCCCTTTCTCACTTGGTAGTCTGTGCGACTT-3'). The DNA oligo was ordered from Integrated DNA Technologies and *in vitro* T7-mediated transcription was performed using the HiScribe™ T7 Quick High Yield RNA Synthesis Kit (NEB, Cat. #E2050) as described in the user manual using 0% or 50% N6-methyladenosine-5'-triphosphate (TriLink, Cat. #N1013) during synthesis. After the purification of IVTs using the RNAClean XP Kit (Beckman Coulter, Cat. #A66514), a poly(A) tail was added to the end of IVTs using *E. coli* Poly(A) Polymerase (NEB, Cat. #M0276) as described in the user manual using 100% Adenosine-5'-Triphosphate. IVTs were labeled with pCp-Cy3 (Jena Bioscience, Cat. #NU-1706-CY3) on the end of the poly(A) tail using T4 RNA Ligase 1 (NEB, Cat. #M0204).

A custom Secure Seal Flowcell was built with the passivated poly(dT50) coverslips. For antibody validation, 0.2 ng of IVT in T50 buffer with 20 U SUPERase·In RNase Inhibitor (Ambion, Cat. #AM2694) were hybridized to the poly(dT50) surface at room temperature for 1 h. Next, to label m⁶A-positive IVTs, the pre-complex of 67 pM anti-m⁶A primary antibody and 200 pM APC-labeled secondary antibody in Imaging buffer (10 mM Tris-HCl pH 8.0, 50 mM NaCl, 0.05% Tween-20, 1 mM Trolox, 50 nM Protocatechuate 3,4-Dioxygenase, 1 mg/mL protocatechuic acid, 0.5 mg/mL bovine serum albumin, 20 U SUPERase·In RNase Inhibitor) was applied to the flow cell and bound for 15 min at 37 °C. After incubation, the imaging cycle was repeated 6 times using customized total internal reflection fluorescence (TIRF) microscopy (Nikon TE with custom-built laser assembly, a Nikon 60X oil objective, and Photometrics CoolSNAP HQ CCD camera). In the two-color images of the same region using Cy3 as an IVT and APC as an antibody complex, respectively, the fluorescent spots were fitted with Gaussian profiles to determine the center positions of the molecules to half-pixel accuracy. The fluorescent spots between two color images, whose center was within a distance of two pixels (~200 nm), were determined as colocalization spots. The detection rate was measured by the colocalization rate of antibody complex and IVT. The antibody sensitivity was measured as the detection rate of true positive on an m⁶A-positive IVT sample and the specificity as the detection rate of true negative on an m⁶A-negative IVT sample.

Dot blot assay for RNA modifications

PolyA+ RNA selection was performed twice using Dynabeads mRNA DIRECT Purification Kit (Invitrogen, Cat. #61011) as described in the user manual. 2x polyA+ RNA samples were spotted onto the membrane, Amersham Hybond-XL (Cytiva, Cat# RPN303s). The membrane was completely dried and crosslinked in a UV STRATALINKER 1800 using the automatic function. The membrane was then blocked for 10 min using sterile RNase, DNase-free TBST + 5% skim milk. The m⁶A primary antibody was then added at a concentration of 1:1,000 in TBST + 5% skim milk at 4°C, overnight. The membrane was washed four times in TBST and then incubated with the secondary anti-rabbit antibody (1:5,000) for 1 h in TBST + 5% skim milk. The membrane was washed four times in TBST and exposed on the ChemiDoc imaging system (Bio-Rad) using Pierce ECL Western Blotting substrate.

Direct RNA sequencing with detection of m⁶A

The total RNA of GM12878 cells was extracted using the RNeasy Mini Kit (QIAGEN, Cat. #74104). 1 ng total RNA in T50 buffer or cell lysates from 1,000 cells in lysis buffer (20 mM Tris-HCl, pH 7.4, 150 mM NaCl, 1 mM MgCl₂, 1 mM EDTA, 0.5% NP-40, 20 U SUPERase·In RNase Inhibitor) was directly captured on the passivated poly(dT50) flow cell for 30 min at room temperature. After rinsing with 1X SSC/ 0.05% SDS three times, the captured RNA was labeled with 100 nM Cy3-dATP using Klenow exo- (NEB, Cat. #M0212) according to the manufacturer's instructions and was incubated with the pre-complex of anti-m⁶A antibody in the imaging buffer for 15 min at 37°C, as described above for antibody validation. The imaging cycle was repeated 6 times using a customized TIRF microscopy system, and the flow cell was cleared of antibody complex by Proteinase K in the T50 buffer. After rinsing with the T50 buffer three times, first-strand cDNA was synthesized on the flow cell as previously described with some modifications (Ozsolak et al., 2010). First-strand cDNA was synthesized with the SuperScript III Reverse Transcriptase (Invitrogen, Cat. #18080093) using the manufacturer's recommendations, except no additional primers were added, and the incubation steps were modified as follows: 37°C for 15 min and 55°C for 15 min. After cDNA synthesis, the unoccupied dT oligos were degraded using Exonuclease I (NEB, Cat. #M0293), and simultaneous poly(G) tailing and RNA degradation were performed using Terminal Transferase (NEB, Cat. #M0315S) as described in the user manual adding 1 mM dGTP and RNase H. After incubation at 37°C for 15 min, 3' ends of poly(G) tails were blocked with a mixture of 0.1 mM ddGTP and 0.1 mM ddATP under the same reaction conditions. The 15-nt poly(dC) primers were hybridized at 50 nM in T50 buffer at 37°C for 15 min, followed by step-wise 'fill' steps with Klenow exo- with a mixture of 0.5 mM dCTP and 0.5 mM dATP according to the manufacturer's instructions. Then, the 'lock' step was performed with Virtual Terminator guanine and Virtual Terminator thymidine nucleotide analogs (SeqLL). Sequencing by synthesis was then initiated using standard procedures (Ozsolak et al., 2010).

m⁶A level calculation

m⁶A level of a specific gene was calculated as a percentage of modified gene-specific transcripts to the total gene-specific transcripts. We required total gene-specific transcript counts of ≥ 10 or log-mean gene expression levels of ≥ 0.02 to obtain reliable m⁶A levels. Single-cell m⁶A levels were calculated using total RNA counts and m⁶A modification counts in each nanowell.

Identification of multiple RNA modifications

To test iterative detection of multiple RNA modifications, we used anti-m⁶A and pseudouridine (ψ) antibodies. To validate antibody specificity, the synthetic RNA fragments (rArC-rX-rUrG, X = A, m⁶A, U or ψ) were ordered from Integrated DNA Technologies. Synthetic RNA fragments (50 ng) were spotted onto the charged nylon membrane, and the antibodies were applied to the membrane with a dot blot assay. Cell lysates in lysis buffer (20 mM Tris-HCl, pH 7.4, 150 mM NaCl, 1 mM MgCl₂, 1 mM EDTA, 0.5% NP-40, 20 U SUPERase-In RNase Inhibitor) were directly captured on a poly(dT50) flow cell for 30 min at room temperature. After rinsing with 1X SSC/0.05% SDS three times, the captured RNA was labeled with Cy3-dATP by Klenow exo- and was incubated with the pre-complex of anti-m⁶A antibody in imaging buffer for 15 min at 37°C. Imaging for m⁶A-modified RNAs was done using customized TIRF microscopy, and then the flow cell was cleared of antibody complex by 40 U/mL Proteinase K in T50 buffer. After rinsing three times with T50 buffer, the imaging process was repeated with the anti- ψ antibody.

Generation of *METTL3* or *PCIF1* knockout cell lines

K562 *METTL3*- or *PCIF1*-knockout cell lines were generated by CRISPR/Cas9 using piggybac vectors. The gRNAs used were: *METTL3*: ATCATTCGGACAGGCCGTAC or GCTCAACATACCCGTACTAC; *PCIF1*: GATCCGTTTGACGTACTCCA or ACTTAACA TATCTGCGGGG; non-targeting controls: ACGGAGGCTAAGCGTCGCAA or CGCTTCCGCGGCCCGTTCAA (Control1 and Control2 respectively, selected from the human GeCKO v2 CRISPR screening library). Annealed double-stranded DNA oligonucleotides corresponding to the gRNAs were ligated into a piggybac vector engineered to contain a U6-gRNA cassette in addition to a CMV promoter driving Cas9-T2A-eGFP. Plasmids were transfected into K562 cells using LipoD293 (SigmaGen, Cat. # SL100668), according to the manufacturer's instructions. The transfected cells were sorted twice by flow cytometry based on eGFP expression. Loss of *METTL3* or *PCIF1* protein expression was confirmed by western blotting using anti-*METTL3* and *PCIF1* antibodies (Bethyl Lab. Cat. #A301-567A, #A304-711A).

LC-MS/MS analysis

For the detection and quantification of m⁶A and cap-adjacent m⁶Am in 2x polyA+ RNA, 400 ng of 2x polyA+ RNA was decapped using 25 Units of RppH (NEB, Cat. #M0356S) in 1X ThermoPol buffer (NEB, Cat. #B9004S) for 3 hours at 37°C, followed by clean up with Zymo RNA Clean and Concentrator-5 Kit (Cat. #R1013). Subsequently, decapped RNA was digested to nucleotides using 20 units of Nuclease P1 (NEB, Cat. #M0660) in a buffer containing 50 mM sodium acetate (pH 5.5) and 0.05 μ M 2'-deoxyadenosine (internal standard) for 3 hours at 37°C. Nucleotides were then dephosphorylated to nucleosides by the addition of 2 units of Shrimp Alkaline Phosphatase (NEB, Cat. #M3071S) in 1X CutSmart buffer for 1 hour at 37°C. After digestion, the sample volume was brought to 100 μ L with ddH₂O followed by filtration using YM-10 centrifugal spin column (Millipore, Cat. #MRCPR010). 5 μ L of the filtered solution was analyzed by LC-MS/MS.

The separation of nucleosides was performed using an Agilent 1290 Infinity HPLC system with an Agilent XDB-C18 reversed-phase column (4.6 x 150 mm, 5 μ m). The mobile phase A was water with 0.1% (v/v) formic acid and mobile phase B was methanol with 0.1% (v/v) formic acid. Online mass spectrometry detection was performed using an Agilent 6460 triple quadrupole mass spectrometer in positive electrospray ionization mode. Quantification of each nucleoside was accomplished in dynamic multiple reaction monitoring (dMRM) mode by monitoring the transitions of 268/136 (A), 252/136 (dA), 282/150 (m⁶A), 296/150 (m⁶Am). The amounts of A, dA, m⁶A and m⁶Am in the samples were quantified using corresponding calibration curves generated with pure standards.

Nanowell and flow cell scanning

To identify cell types or quantify cell surface protein expression levels on the nanowell array (Figure 2A), cell preparation and imaging were performed as previously described with some modifications (Gierahn et al., 2017). K562 and YAC1 cells were resuspended in F-PBS buffer (1X cold PBS with 2% FBS) and nuclear staining dyes (1:1000 Hoechst 33342 and SYTO9 or SYTO87; Invitrogen, Cat. #62249, #S34854, #S11363). Cells were washed twice with and resuspended in F-PBS. The nanowell array was washed with 6 mL of 95% ethanol once and 1X cold PBS, 5 times. To maximize the number of single-cell occupied wells, 3.0×10^4 cells (~60% of the number of nanowells) of K562 and YAC1 mixture (1:1 ratio) were loaded onto the array and washed twice with 6 ml of 1X cold PBS. The array was imaged with a Zeiss (LSM 800) fluorescent microscope with a 5X objective. MUT3 cells were resuspended in F-PBS buffer with 1:100 anti-CD14 (Beckman Coulter, Cat. #IM0643) and anti-CD34 (BD Biosciences, Cat. #348050) primary antibodies for 30 min at room temperature and washed twice with F-PBS buffer. The MUT3 cells were stained in F-PBS buffer with 1:200 fluorophore-labeled anti-mouse IgG1 and anti-mouse IgG2a (ThermoFisher, Cat. #A21123 and #A21241) cross-adsorbed secondary antibodies and 1:1000 Hoechst 33342 for 30 min at room temperature.

After nanowell scanning for cell type identification, the array then hybridized to the passivated poly(dT50) coverslip. To lyse the loaded cells, the array was covered with 400 μ L lysis buffer (20 mM Tris-HCl, pH8.0, 150 mM NaCl, 5 mM MgCl₂, 1 mM EDTA,

0.2% NP-40, SUPERase·In RNase Inhibitor) and immediately sealed with the poly(dT50) coverslip using the manual clamp (Agilent, Cat. #G2534A). The sealed array was incubated for 1 h at 4°C and then submerged in 1X cold PBS to detach the coverslip. The custom Secure Seal Flowcell was assembled with the coverslip and washed three times with 1X SSC/ 0.05% SDS. FluoSphere beads (ThermoFischer, Cat. #F8807) were applied on the flow cell as an alignment marker through all rounds of antibody detection and serial hybridization for seqFISH. To visualize the transcriptome spatially separated on the coverslip from each nanowell, the captured RNA was labeled with 100 nM Cy3-dATP by Klenow exo- (NEB, Cat. #M0212) according to the manufacturer's instructions, and 31 x 51 field of views (FOVs) were imaged using a customized TIRF microscope.

Primary probe design for seqFISH

Gene-specific primary probes were designed as previously described with some modifications (Eng et al., 2017). Probe sets were crafted separately for each gene using OligoMiner (Beliveau et al., 2018) and then refined as a full set to mitigate cross-hybridization in the experiment. Individual probe sets were first crafted using exons only from the consensus regions of all spliced isoforms of the gene, filtered by ClustalW. We chose 25–30 nt sequences corresponding to such exons and calculated their GC content. Probe sequences that fell outside of the allowed GC range (45–70% in this case) were excluded. We also removed any probe sequences that contained five or more consecutive nucleotide bases of the same kind. All probes were at least 2-nt distance from each other on the target sequence. To minimize cross-hybridization between probe sets, a local BLAST database was constructed from all the viable probe sequences, and the probes were queried against it. All probes with matches of 17 nt or longer between probes were removed by dropping the matched probe from the probe set.

For this experiment, the targeted probe set size range was set to 20–30 probes. Any probe set with more than 32 probes was trimmed down by removing probes with the farthest distance from the targeted 55% GC content. We used the 20 nt readout sequences as previously described with some modifications (Eng et al., 2017). We used BLAST to remove any sequences that matched with any contiguous homology sequences longer than 14 nt to the human transcriptome. The reverse complements of these readout sequences were included in the primary probes, and we added 'TA' gap sequence between probe and readout sequences. Primary probes were ordered as OligoPools from Integrated DNA Technologies (IDT) and resuspended in the primary probe hybridization buffer composed of 2X SSC (ThermoFisher, Cat. #15557036), 30% formamide (Sigma, Cat. #F9037) and 10% (w/v) Dextran Sulfate (Sigma, Cat. #D8906).

Readout probe synthesis for seqFISH

20-nt, 5'-amine-modified readout probes (IDT) were resuspended in 100 mM Sodium Bicarbonate Buffer. Azido-PEG3-SS-NHS (Conju Probe, Cat. #CP-2060) was reacted with 5' amine-modified oligonucleotides at a 1:100 molar ratio in Sodium Bicarbonate Buffer for at least 6 h or overnight at room temperature on a shaker. Then, the crude mixture was purified using Illustra NAP-5 columns (GE Healthcare, Cat. #17-0853-01) and stored at -20°C. The oligonucleotides were mixed with AFDye 647 DBCO (Click Chemistry Tools, Cat. #1302-1) at a 1:10 molar ratio in Sodium Bicarbonate Buffer for at least 2 h at room temperature and added to Azide Magnetic Beads (Click Chemistry Tools, Cat. #1036-1) at a 1:20 molar ratio for 4 h at room temperature on a shaker. To remove the magnetic beads, the mixtures were placed on a magnet and the supernatant containing dye-labeled cleavable oligonucleotides was removed and stored at -20°C until the seqFISH experiment.

Gene expression measurement using seqFISH

Sequential fluorescence *in situ* hybridization was performed as previously described with some modifications (Eng et al., 2017). Once poly(A)⁺ RNA and m⁶A-modified RNA on the poly(dT) coverslip were imaged, the surface was treated with 40 U/mL proteinase K in 100 μL T50 buffer for 15 min at 37°C to completely clear antibody probes. A mixture of 222 probes (1 nM/probe) in 100 μL hybridization buffer containing 2X SSC (ThermoFischer, Cat. #15557036), 30% formamide (Sigma, Cat. #F9037), 10% (w/v) Dextran Sulfate (Sigma, Cat. #D8906), and 200 U/mL SUPERase·In RNase Inhibitor was hybridized to the target mRNA at 37°C for at least 16 h in a humid hybridization chamber. After hybridization, the sample was washed for 30 min at room temperature with the washing buffer containing 2X SSC, 40% formamide, 0.1% Triton X-100, and 200 U/mL SUPERase·In RNase Inhibitor to eliminate nonspecific binding of the primary probes. The sample was then washed three times with 2X SSC and 200 U/mL SUPERase·In RNase Inhibitor. Each readout probe hybridization solution contained each dye-labeled readout oligonucleotide probe (10 nM) in the hybridization buffer comprising 2X SSC, 10% formamide, 10% (w/v) Dextran Sulfate (Sigma, Cat. #D4911), and 200 U/mL SUPERase·In RNase Inhibitor. Each serial hybridization took 15 min at 37°C for optimal fluorescent signals followed by washing once for 2 min with a high-stringency buffer containing 2X SSC and 20% formamide. Once the readout probe hybridization was complete, FOVs were imaged with 500 ms exposure in oxygen-scavenging T50 buffer containing 10 mM Tris-HCl pH 8.0, 50 mM NaCl, 0.05% Tween-20, 1 mM Trolox, 50 nM Protocatechuate 3,4-Dioxygenase, 1 mg/mL protocatechuate, and 200 U/mL SUPERase·In RNase Inhibitor. Imaging was done using customized TIRF microscopy. Once imaging was complete, a reduction buffer containing 2X SSC, 50 mM TCEP (Sigma, Cat. #646547), 0.1% Triton X-100, and 200 U/mL SUPERase·In RNase Inhibitor was flowed into the flow cell and incubated for 2 min to completely cleave fluorophores on the readout oligonucleotides. Then, 2X SSC buffer supplemented with 200 U/mL SUPERase·In RNase Inhibitor was flown through the flow cell repeatedly 5 times for 2 min to remove the remaining TCEP solution. The whole process was repeated for each gene of interest, until 9 rounds of hybridizations were imaged. Generally, a seqFISH experiment takes ~7 h for imaging 200~300 FOVs.

QUANTIFICATION AND STATISTICAL ANALYSIS

Registration of scanning images

To find X/Y coordinates of and measure the fluorescence intensity of single cells on the multicolor images of the nanowell array, we used automated image analysis by ‘find maxima’ algorithm and custom scripts on ImageJ (<https://github.com/Kim-KL/scRNAMod>). Scatter plot analysis of fluorescence intensities was used to identify cell types. A cell occupancy matrix (COM, 121 x 381) was used to identify the nanowells occupied with a single cell. From 31 x 51 FOV images on the flow cell, automated image analysis by custom scripts on ImageJ and R was used to count the number of fluorescence signals as a quantity of captured RNA molecules and generate the matrix of RNA density per FOV (RDM, 31 x 51). The RDM was registered in the COM by searching the 31 x 51 subset of COM with the highest 2D correlation coefficient using 2D cross correlation in R (Figures 2A and S2C–S2E) (Brown, 1992). With reference to the registered COM subset, doublets and empty wells were excluded from further analysis, and each registered single cell was linked with cell phenotypes from multicolor fluorescence images on the nanowell array.

Single-molecule image processing

Image processing and analysis were performed as previously described with some modifications (Eng et al., 2017; Kim et al., 2018). To remove background signal, the rolling-ball background subtraction with a radius of 3 pixels and Gaussian blur with 1.1 sigma value on ImageJ were applied on the single-molecule images. All fluorescent signals that could be identified as potential RNA or modification signals were found by finding local maxima in the image above a predetermined pixel threshold in the FOVs and fitting to a 2D Gaussian function to determine the center positions of the molecules to sub-pixel accuracy. The spots in different color channels, whose center was within a distance of 1 pixel (~100 nm), were determined as colocalization signals using a custom Python script (<https://github.com/Kim-KL/scRNAMod>).

As the bright fluorescent signals from the FluoSphere beads (660/680) permanently appeared in the FOV, these signals were used to align all sets of images including antibody detection and seqFISH using a phase cross correlation.

Unsupervised mapping of cell types from seqFISH

To visualize similarities between single cells in two-dimensional space, we employed t-distributed stochastic neighbor embedding (t-SNE). We processed seqFISH images into an expression matrix consisting of 9 genes and 111 single cells. This matrix was annotated by cell color intensity, captured RNA density, and m⁶A-modified RNA density for single cells. Gene expression values were normalized by dividing gene-specific counts with the total number of captured RNA molecules for each cell. We then computed log₂ transformed expression values, followed by subtraction of the average gene expression value across all cells. Single cell house-keeping gene expression values (GAPDH, ENO1, EEF2) were used as a quality control. For t-SNE visualization, we used the Rtsne implementation in R and default parameters, except setting the perplexity to 10. The visualization was used to highlight additional cell parameters, such as cell color intensity profile, capture RNA density, m⁶A level, and gene expression levels.

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Supplemental information

**Systematic detection of m⁶A-modified transcripts
at single-molecule and single-cell resolution**

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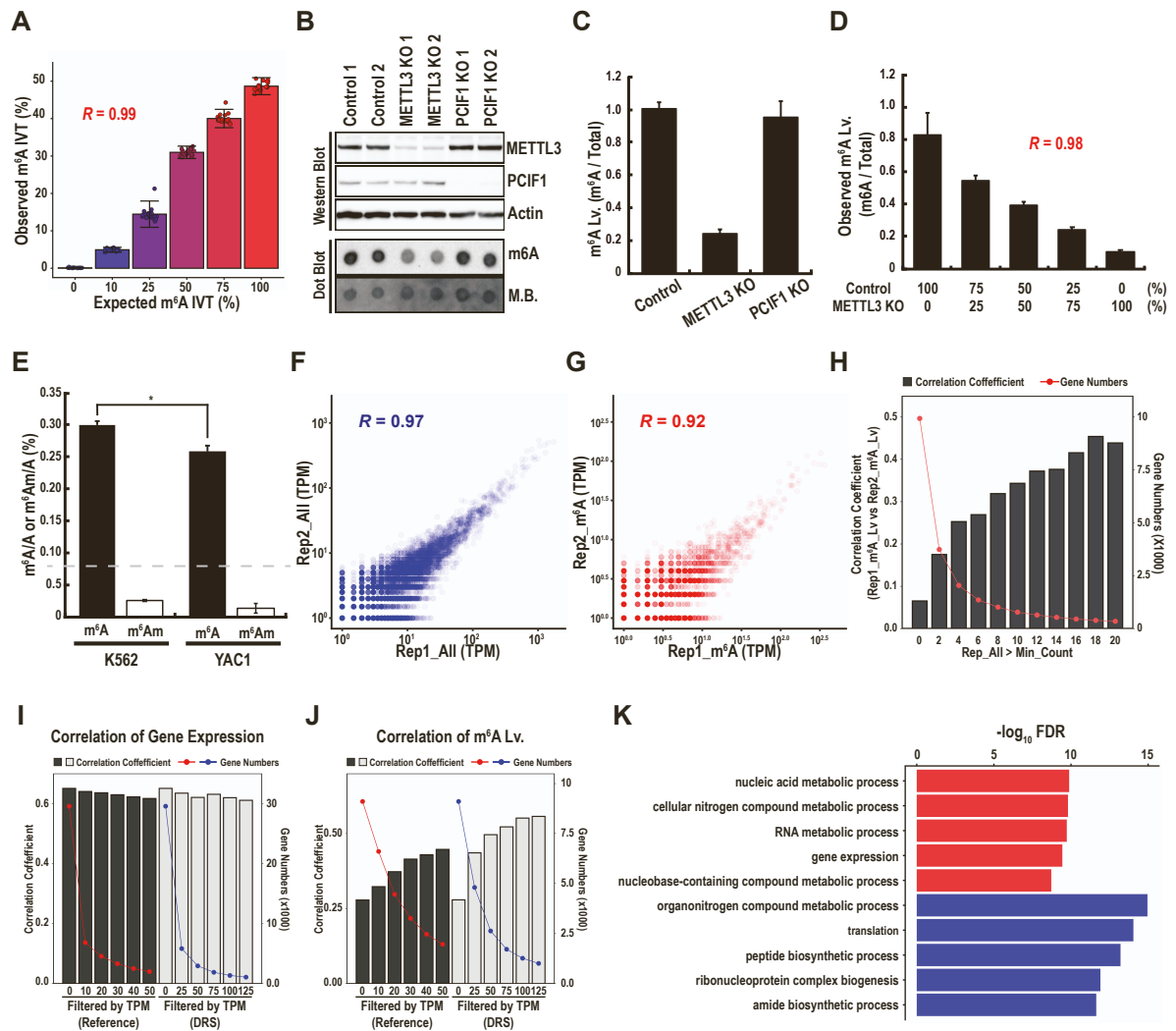


Figure S1. Validation of antibody detection for m⁶A RNAs and gene expression profiling at single-molecule resolution, Related to Figure 1. **A.** Bar plot compares the level of observed versus expected m⁶A levels of m⁶A(-/+) RNAs in 6 independent single-molecule assays. The methylated RNA transcripts were generated via *in vitro* transcription utilizing N⁶-methyladenosine-5'-triphosphate. The m⁶A-positive RNAs were mixed with unmodified RNA molecules at the indicated ratios to produce specific m⁶A levels. The Pearson correlation coefficient and *P*-value are 0.99 and 1.1×10^{-4} , respectively ($n = 10$). **B.** Top: CRISPR-mediated *METTL3* or *PCIF1* knockout (KO) in K562 cells was assessed by anti-*METTL3* and *PCIF1* immunoblotting. β -actin, loading control. Bottom: Anti-m⁶A dot blot using 100 ng of double polyA-selected (2x polyA⁺) RNA from wild-type (WT), *METTL3* or *PCIF1* KO K562 cells. **C.** Bar plot representing m⁶A quantifications of 2x polyA⁺ RNAs of WT, *METTL3* or *PCIF1* KO K562 cells in single-molecule assays. **D.** Bar plot shows the linearity of m⁶A detection rates in 5 independent single-molecule assays using a mixture of 2x polyA⁺ RNAs

of WT and *METTL3* KO K562 cells at the indicated ratios. The Pearson correlation coefficient and *P*-value are 0.98 and 1.8×10^{-3} , respectively ($n = 2$). E. Liquid chromatography-MS/MS m^6A or m^6Am to A percentages of 2x polyA+ RNAs from K562 and YAC1 cells. Dashed line: lower limit of the calibrated range per our m^6Am standard inputs. * $p < 0.05$, error bar represents standard error ($n = 2$). (F, G) Scatter plot across (F) all transcripts and (G) m^6A -positive transcripts using LQ-DGE. H. Bar and line plots show correlation coefficient between the replicates of our modified LQ-DGE assay and qualified gene numbers, respectively, depending on the cut-off of expression levels as read counts. (I, J) Bar plots show the correlation coefficients of gene expression (I) and m^6A levels (J) between our modified LQ-DGE (total: 0.51 M reads and $m^6A(+)$: 0.14 M reads) and m^6A -LAIC-seq (m^6A -negative or m^6A -positive sample: each 50 M reads). Line plots show qualified gene numbers depending on the cut-off of gene expression levels. K. Gene-Ontology (GO) analysis of top and bottom 500 genes with the highest (red) and lowest (blue) methylation levels.

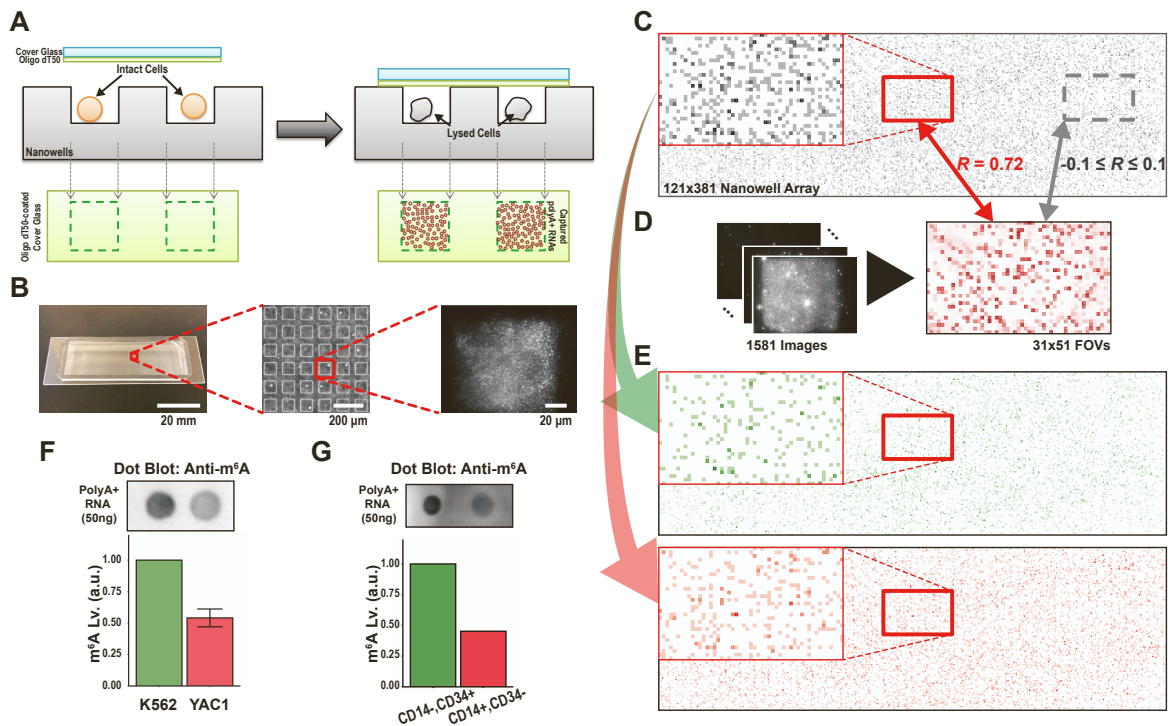


Figure S2. Single cell analysis using a nanowell array, Related to Figure 2. A. Spatial isolation of single cells and their transcriptomes. Single cells were captured randomly and lysed on a nanowell array. After lysis, the array was immediately sealed with an oligo dT-coated coverslip. B. Cell-loaded nanowells, optimized Poisson loading of single cells on nanowell array, and cluster of polyA⁺ RNAs on an oligo dT-coated coverslip. C. Cell occupancy matrix (COM) from a 46,101 nanowell capture array (121x381 nanowells). The number of cells per nanowell was determined through on-array fluorescent imaging of stained nuclei. Based on the 2D image pixel coordinates of nuclei, each cell was assigned to a specific nanowell. D. RNA density matrix (RDM) from a selection of 1,581 nanowell images (31x51 FOV) representing the number of captured polyA⁺ RNA molecules per FOV. Single cell position registration was performed using a custom R script and 2D cross-correlation to overlay the COM and RDM matrices. E. COM of K562 (green) or YAC1 (red) annotated with color intensity profile of single cells from on-array multicolor fluorescent images. (F, G) Anti-m⁶A dot blot using 50 ng RNA that was polyA-selected twice using Oligo dT beads and quantification of the dot blot result by densitometry analysis. F. K562 and YAC1. G. subpopulations of MUTZ3 cells sorted by flow cytometry.

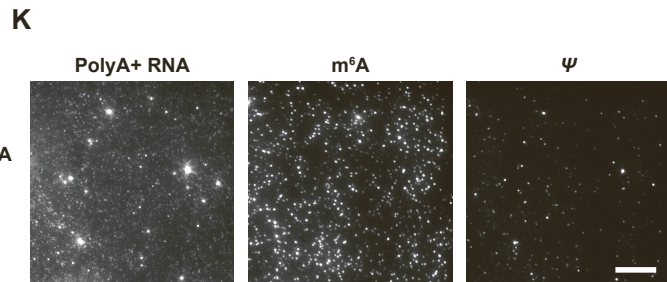
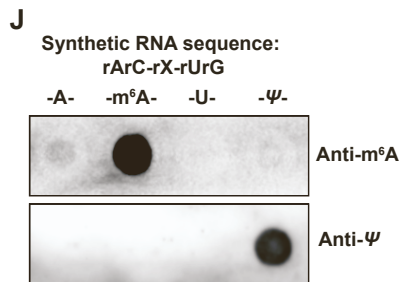
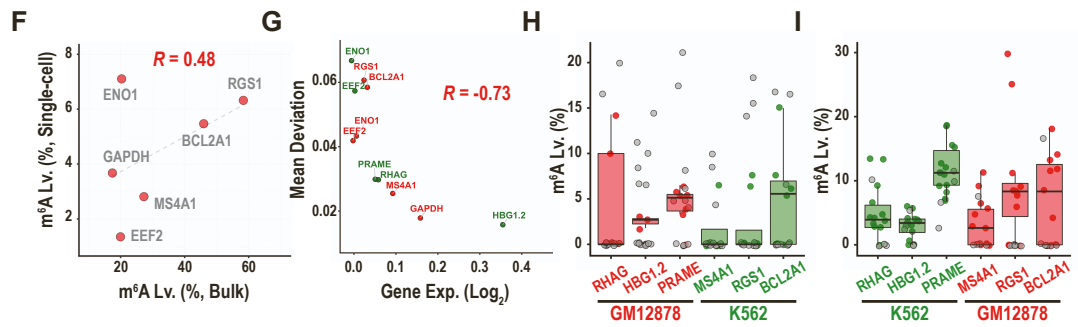
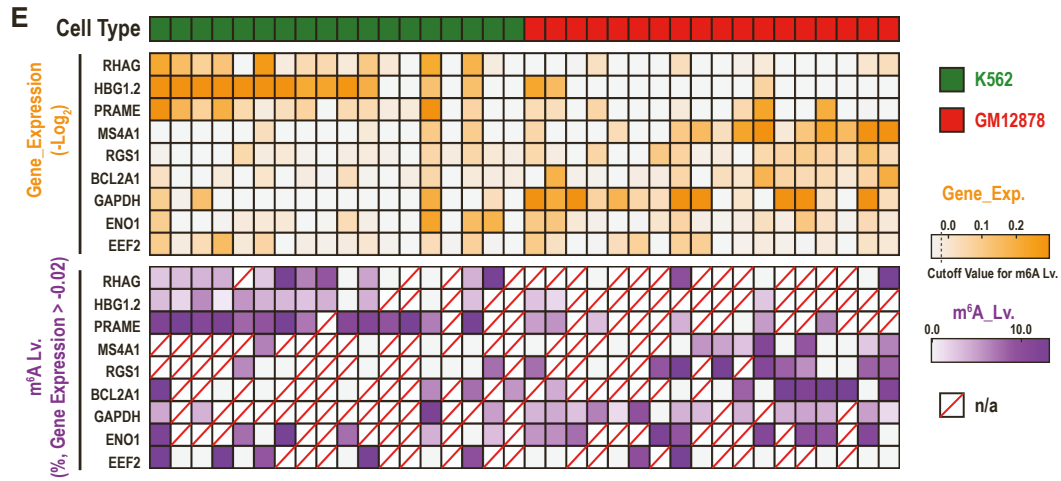
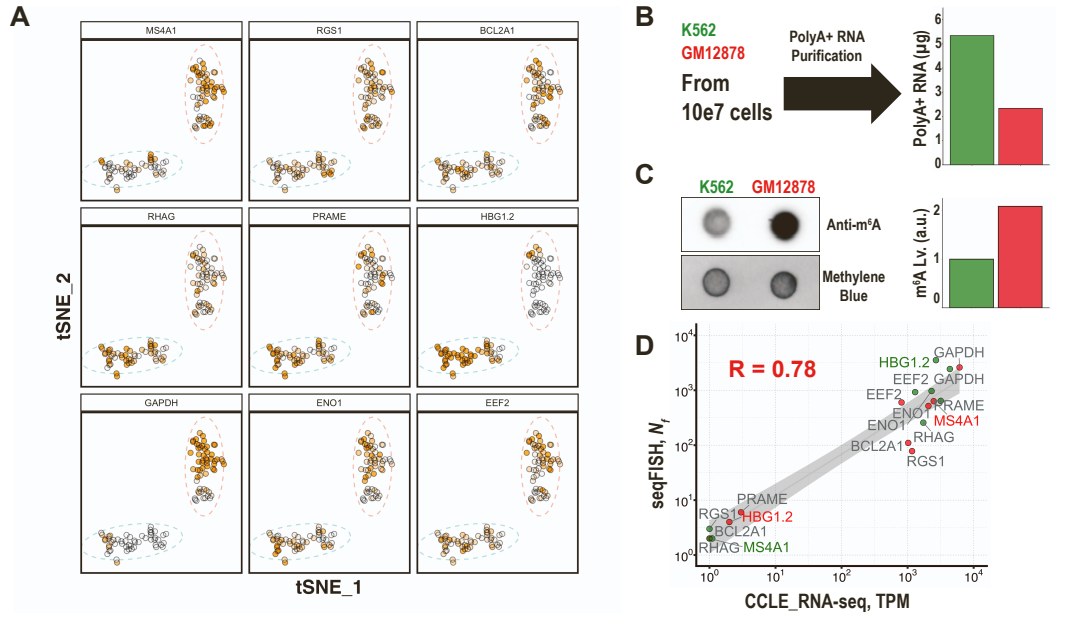


Figure S3. Combination of single-cell analysis and seqFISH, Related to Figure 3. A. t-distributed stochastic neighbor embedding (t-SNE) visualization of 111 qualified single-cell seqFISH profiles colored with relative expression levels of 9 genes (orange). B. Quantification of 2x polyA+ RNA purified from 10 million K562 (green) or GM12878 (red) cells using oligo dT beads. C. Left: Anti-m⁶A dot blot using 50 ng polyA+ RNA of indicated cell lines. Right: Quantification of the dot blot result by densitometry analysis. D. Scatter plot showing correlation between bulk seqFISH results and CCLE RNA-seq data (K562, green; GM12878, red). N_f , average number of fluorescent molecules per imaging area (15,400 μm^2). E. Heatmap showing relative expression of 9 genes (orange) and gene-specific m⁶A levels (purple) across single cells (K562, green; GM12878, red). m⁶A levels of genes with log-mean expression greater than cutoff value (-0.02) are shown. Positions marked with a red diagonal line represent 'Not Applicable' values (n/a), meaning that the single-cell gene expression is not greater than cutoff value. F. Scatter plot representing the correlation between gene-specific m⁶A levels of GM12878 at the single-cell level and in the bulk cell line experiment (Figure 1). G. Scatter plot showing the correlation between relative gene expressions and mean deviation of m⁶A levels implying the variable volatility. The Pearson correlation coefficient is indicated on the plot. H-I. Box and column scatter plots show single-cell gene-specific m⁶A levels with log-mean gene expressions greater than -0.02 (K562, green; GM12878, red). Gray dots in the column scatter plots represent gene expression measurements with 'n/a' m⁶A levels. J. Anti-m⁶A and anti-pseudouridine (Ψ) dot blot assays using 50 ng synthetic RNA fragments. K. Iterative single-molecule blotting assay to identify combinatorially modified RNA molecules. From GM12878 lysates, polyA+ RNAs were captured on the oligo dT-coated flow cell. The captured RNAs were labeled with Cy3-dATP using a Klenow exo- reaction. The m⁶A-modified RNAs were detected by 0.33 nM anti-m⁶A antibody coupled with 1.33 nM Alexa Fluor 647-labeled secondary antibody. The antibody complexes were cleared by Proteinase K, followed by detection of Ψ -modified RNAs using 0.33 nM anti- Ψ antibody and the secondary antibody. Scale bar, 10 μm .