# **Epitranscriptome sequencing technologies: decoding RNA modifications**

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In recent years, major breakthroughs in RNA-modification-mediated regulation of gene expression have been made, leading to the emerging field of epitranscriptomics. Our understanding of the distribution, regulation and function of these dynamic RNA modifications is based on sequencing technologies. In this Review, we focus on the major mRNA modifications in the transcriptome of eukaryotic cells:  $N^6$ -methyladenosine,  $N^6$ ,2'-O-dimethyladenosine, 5-methylcytidine, 5-hydroxylmethylcytidine, inosine, pseudouridine and  $N^1$ -methyladenosine. We discuss the sequencing technologies used to profile these epitranscriptomic marks, including scale, resolution, quantitative feature, pre-enrichment capability and the corresponding bioinformatics tools. We also discuss the challenges of epitranscriptome profiling and highlight the prospect of future detection tools. We aim to guide the choice of different detection methods and inspire new ideas in RNA biology.

More than 100 distinct chemical modifications to RNA have been characterized to date. They are present in abundant noncoding RNAs (ncRNAs)-including ribosomal RNA (rRNA), transfer RNA (tRNA) and small nuclear RNA (snRNA)—and are important for maintaining the proper functions of ncRNAs in translation and splicing. Several modifications, including N<sup>6</sup>-methyladenosine (m<sup>6</sup>A), 5-methylcytidine (m<sup>5</sup>C), inosine (I), pseudouridine ( $\Psi$ ),  $N^1$ -methyladenosine ( $m^1A$ ) and 5-hydroxylmethylcytidine (hm<sup>5</sup>C), are found internally in eukaryotic mRNA and can influence the metabolism and function of mRNA<sup>1</sup> (Fig. 1). Thus, the multitude of RNA modifications together were first designated 'RNA epigenetics' in 2010 (ref. 2), and the term 'epitranscriptome' was coined in 2012 (ref. 3) in analogy to epigenetic regulation mediated by modifications to DNA and histone.

However, functional studies of the epitranscriptome lagged behind those of the epigenome on account of the lack of sensitive and robust sequencing technologies that could detect these epitranscriptomic marks in a transcriptome-wide manner. Several major challenges exist for mapping the epitranscriptome. First, the majority of RNA modifications cannot be directly detected by highthroughput sequencing. Because chemical modifications to RNA often do not change the base pairing properties of the modified bases, reverse transcription (RT) will simply erase these modifications and render them indistinguishable from the regular RNA bases. Second, while rRNA, tRNA and snRNA are abundant, other types of cellular RNA—for instance, mRNA and long noncoding RNA (lncRNA)—can be of low abundance. Third, there is a lack of existing computational tools to facilitate the identification of modification sites from sequencing data.

Fortunately, recent years have witnessed major advances in the development of novel transcriptomewide sequencing technologies for distinct epitranscriptomic marks. These new tools have helped researchers to identify the location of RNA modifications and to reveal these modifications' distinct distribution patterns throughout the transcriptome. When these sequencing methods are combined with other emerging tools (for instance, genome-editing tools), targets of RNAmodifying enzymes have been identified. In addition, these technologies have uncovered the dynamic nature of

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distinct epitranscriptomic marks under different physiological conditions. Furthermore, these tools have enabled the discovery of 'reader' proteins that selectively recognize specific epitranscriptomic marks and determine their function. Hence, new sequencing tools not only allow comprehensive profiling of the epitranscriptome but are also valuable resources for functional epitranscriptomic investigations.

While many excellent reviews have summarized the biological functions of different epitranscriptomic marks<sup>4–9</sup>, here we focus on the principles of the sequencing technologies, their bioinformatics algorithm, detection scale, resolution and ability to yield quantitative information. The stoichiometry of RNA modifications is important for assessing the extent of biological impact one modified nucleotide could have on the entire transcript. We also look at whether a given detection method is capable of pre-enrichment before sequencing, which determines the sensitivity of a sequencing method, the required sequencing depth and thus costs.

#### m<sup>6</sup>A, the first reversible mRNA modification

 $m^6A$  is the most abundant internal mRNA modification in eukaryotes (**Supplementary Table 1**). It is catalyzed by a methyltransferase complex, or 'writers', which includes at least METTL3, METTL14 and WTAP<sup>10–15</sup>.  $m^6A$  is the first reversible RNA modification found in eukaryotic cells; it can be demethylated by FTO and ALKBH5 (termed 'erasers')<sup>16,17</sup>. In fact, it is the discovery of the reversible nature of  $m^6A$ that led to renewed interest in this long-known mRNA modification<sup>2</sup>. In addition, multiple  $m^6A$ -specific binding proteins ('readers') have been identified, and these reader proteins can affect the metabolism and function of  $m^6A$ -marked mRNAs in various ways<sup>18–24</sup>. Besides its regulatory roles in mammalian cells,  $m^6A$  can also be installed on viral RNA and influences virus infection and production<sup>25–29</sup>.

m<sup>6</sup>A in mRNA was first discovered in the 1970s (ref. 30); follow-up studies revealed several abundant m<sup>6</sup>A sites that are associated with an RRACH (R = A/G, H = U/A/C) consensus sequence<sup>31–33</sup>. However, a transcriptome-wide profile of m<sup>6</sup>A in mammalian cells remained unclear until two groups independently developed two robust methods in 2012, both of which are based on m<sup>6</sup>A-specific methylated immunoprecipitation and high-throughput sequencing (m<sup>6</sup>A-seq<sup>19</sup> and MeRIP-seq<sup>34</sup>). In these methods, purified mRNA is fragmented to ~100–150 nt and immunoprecipitated by an m<sup>6</sup>A-specific antibody. The enriched m<sup>6</sup>A-containing RNA fragments are then subjected to library construction and high-throughput sequencing (**Fig. 2a**). These two methods have identified approximately 10,000 of m<sup>6</sup>A peaks in the mammalian transcriptome and revealed for the first time that m<sup>6</sup>A

peaks are enriched in 3' UTRs and near stop codons. These methods, which have a resolution of 100-200 nt, are easily manageable; they were quickly adopted by many different laboratories and have enabled many important discoveries in the field of epitranscriptomics. Later, a modified m<sup>6</sup>A immunoprecipitation method of higher resolution was reported and applied to the study of yeast in meiosis<sup>35</sup>. In this method, a yeast strain deficient in m<sup>6</sup>A methyltransferases is used as a negative control to eliminate the false-positive peaks (Fig. 2a). In addition, shorter m<sup>6</sup>A fragments and a ligation-based strand-specific library preparation protocol are used to increase the m<sup>6</sup>A detection resolution; together with the knowledge of the m<sup>6</sup>A consensus motif, a nearly single-base-resolution m<sup>6</sup>A profile in yeast is obtained. Collectively, these early methods reveal the transcriptome-wide m<sup>6</sup>A landscapes in eukaryotic cells and provide valuable tools for functional studies of m<sup>6</sup>A, which is now unambiguously established as a key epitranscriptomic mark.

Recently, UV-induced RNA-antibody crosslinking strategies have been adapted into the m<sup>6</sup>A-seq and MeRIP-seq protocols, allowing identification of base-resolution m<sup>6</sup>A methylomes in human cells. Two types of UV-crosslinking are used; the first incorporates photoactivatable ribonucleoside-enhanced crosslinking and immunoprecipitation (PAR-CLIP), hence leading to photo-crosslinkingassisted m<sup>6</sup>A sequencing strategy (PA-m<sup>6</sup>A-seq)<sup>36</sup>. In this strategy, 4-thiouridine (4SU) is incorporated into RNA by adding 4SU into the growth medium. After m<sup>6</sup>A immunoprecipitation, the recovered m<sup>6</sup>A-containing RNA is crosslinked to the anti-m<sup>6</sup>A antibody under 365-nm UV light. The crosslinked RNA is then digested to ~30 nt using RNase T1 and subjected to sequencing (Fig. 2b). Because 4SU induces a T-to-C mutation at the site of crosslinking, PA-m<sup>6</sup>A-seq efficiently increases the signal-to-noise ratio of methylation detection. In addition, by combining the single consensus methylation sequences within the ~25-30 nt windows, m<sup>6</sup>A sites can be detected at single-base resolution. Yet, for m<sup>6</sup>A modifications that do not have a nearby site for 4SU incorporation, these m<sup>6</sup>A sites may be missed in this method. The other UV-crosslinking strategy takes advantage of crosslinking immunoprecipitation (UV CLIP), leading to m<sup>6</sup>A-CLIP and m<sup>6</sup>A individual-nucleotide-resolution crosslinking and immunoprecipitation (miCLIP), respectively<sup>37,38</sup>. In m<sup>6</sup>A-CLIP and miCLIP, RNA fragments are immunoprecipitated and crosslinked to antibody by 254-nm UV light. Unlike m<sup>6</sup>A-seq, which uses competition elution to recover the m<sup>6</sup>A-containing RNA, both m<sup>6</sup>A-CLIP and miCLIP use proteinase K to retrieve the crosslinked RNA. The protein-RNA crosslinking sites lead to patterned mutational or truncation profiles during RT, thereby revealing the precise position of m<sup>6</sup>A (**Fig. 2c**).

Despite these advances in the detection resolution, the stoichiometry of m<sup>6</sup>A sites remains unclear. In 2013, a method called site-specific cleavage and radioactive-labeling followed by ligation-assisted extraction and thin-layer chromatography (SCARLET) was developed<sup>39</sup>. This method can quantify m<sup>6</sup>A stoichiometry at specific loci. Recently, a method called m<sup>6</sup>A-level and isoform-characterization sequencing (m<sup>6</sup>A-LAIC-seq) was developed to quantify the m<sup>6</sup>A stoichiometry in a transcriptome-wide fashion<sup>40</sup>. In m<sup>6</sup>A-LAIC-seq, fulllength RNAs are used in the m<sup>6</sup>A immunoprecipitation experiments, and an excess of antibody is used to ensure that all m<sup>6</sup>A-containing RNA are pulled down. External RNA Controls Consortium (ERCC) spike ins are added into the input, supernatant and eluate RNA pools as internal standards. The m<sup>6</sup>A levels per gene can be quantified by the ERCC-normalized ratio of RNA abundances in different pools ((eluate)/(eluate + supernatant)) (**Fig. 2d**). m<sup>6</sup>A-LAIC-seq reveals that

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most genes exhibit less than 50% m<sup>6</sup>A-methylation levels; another key finding of the method is that transcripts marked by m<sup>6</sup>A are coupled with proximal alternative polyadenylation sites, resulting in shortened 3' UTRs.

While both single-base and quantitative sequencing technologies for m<sup>6</sup>A have been developed, several challenges still remain. First, although changes of m<sup>6</sup>A stoichiometry of the same site in different samples can be obtained by m<sup>6</sup>A-LAIC-seq, it is currently difficult to compare the methylation levels between different sites in the same transcript because full-length RNA is used in m<sup>6</sup>A-LAIC-seq. Second, it was noted that m<sup>6</sup>A profiling could be heavily impacted by bioinformatics analysis (the choice of peak detection, alignment methods, etc.)<sup>3</sup>. Hence, caution should always be taken when analyzing and comparing sequencing data (this is also applicable to other RNA modifications). Third, all existing technologies rely on the m<sup>6</sup>Aspecific antibodies; yet, it has actually been shown in the yeast study that these antibodies could have intrinsic bias on RNA sequences and secondary structures<sup>35</sup>. Hence, new methods that are independent of antibodies are still desired.

#### m<sup>6</sup>Am, at the beginning of an mRNA polynucleotide

 $\rm m^6Am$  is a cap-related modification and occurs at the first nucleotide after the 7-methylguanosine cap  $^{41}$ . When a 2'-O-methyladenosine residue is present in the 'capped' 5' end of mRNA, a methyl group can then be installed on the 2'-O-methyladenosine  $^{42,43}$ . As m<sup>6</sup>Am is rec-

ognized by the anti-m<sup>6</sup>A antibody<sup>44</sup>, m<sup>6</sup>A-seq also detects the m<sup>6</sup>Am near the transcription start site (TSS)<sup>15,19</sup>. In the single-base miCLIP technology, m<sup>6</sup>Am sites can be more precisely identified by detecting crosslinking-induced truncation sites (CITSs) at the 5' UTR<sup>38</sup>. These truncation sites in 5' UTR tend to occur in BCA (B = C/U/G) motifs rather than in the canonical RRACH motifs for m<sup>6</sup>A. This observation is consistent with the known pyrimidine-rich sequence at TSSs, and it also indicates that these sites are bona fide m<sup>6</sup>Am rather than internal m<sup>6</sup>A. Although the content of m<sup>6</sup>Am in mRNA is approximately 30-fold lower than that of m<sup>6</sup>A (ref. 40) (**Supplementary Table 1**), great care must still be taken to ensure the recognition specificity of the antibody.

### m<sup>5</sup>C, more challenging to detect than its DNA counterpart

 $\rm m^5 dC$  is a widespread epigenetic marker in DNA and has been extensively studied.  $\rm m^5 C$  is also found in abundant noncoding RNAs including tRNA and rRNA<sup>1</sup>. In tRNA, m<sup>5</sup>C can stabilize the secondary structure and influence the anticodon stem-loop conformation<sup>45,46</sup>; in rRNA, m<sup>5</sup>C can affect translational fidelity<sup>47</sup>. Two RNA methyltransferases, NSUN2 and DNMT2, have been identified to catalyze m<sup>5</sup>C methylation in higher eukaryotes<sup>48,49</sup>.

To detect m<sup>5</sup>dC on DNA, bisulfite treatment has been widely used. However, on account of the significant degradation of nucleic acids during bisulfite treatment, bisulfite-based protocol cannot be directly used for m<sup>5</sup>C detection in RNA. Thus, a modified bisulfite



Figure 2 | Transcriptome-wide sequencing methods for m<sup>6</sup>A. (a) m6A-seq and MeRIP-seq. WT, wild type. (b) PA-m<sup>6</sup>A-seq. The black bold bars in the figure represent T-to-C transitions induced by 4SU and crosslinking. (c) miCLIP. (d) m<sup>6</sup>A-LAIC-seq.



Figure 3 | Detecting m<sup>5</sup>C in the transcriptome. (a) Bisulfite-seq. (b) m<sup>5</sup>C-RIP. (c) Aza-IP. (d) miCLIP.

treatment protocol was developed; this protocol allows m<sup>5</sup>C-site detection in tRNA and rRNA<sup>50</sup>. In 2012, a m<sup>5</sup>C methylome was obtained in a transcriptome-wide manner by combining modified bisulfite treatment and high-throughput sequencing<sup>51</sup> (**Fig. 3a**). This method identified more than 8,000 potential m<sup>5</sup>C sites in human mRNA. However, because of the incomplete conversion of regular cytosines in the dsRNA regions and other modifications resistant to bisulfite treatment, others have suggested that these sites include potential false positives<sup>6,52,53</sup>. Furthermore, because the bisulfite treatment leads to significant RNA degradation and cannot preenrich m<sup>5</sup>C-containing RNA, this method requires high sequencing depth to detect methylation in low-abundance RNA<sup>52</sup>. In a different study, m<sup>5</sup>C sites of *Sulfolobus solfataricus* mRNA identified using bisulfite sequencing have been validated by m<sup>5</sup>C RNA immunoprecipitation (m<sup>5</sup>C-RIP)<sup>54</sup> (**Fig. 3b**).

Recently, two different approaches have been developed to identify the direct targets of the m<sup>5</sup>C RNA methyltransferases. One is 5-azacytidine-mediated RNA immunoprecipitation (Aza-IP), which exploits the catalytic mechanisms of the m<sup>5</sup>C methyltransferases to covalently link methyltransferase to its RNA targets<sup>55</sup>. First, the cytidine analog 5-azacytidine is randomly incorporated into the nascent RNA of cells overexpressing an epitope-tagged m<sup>5</sup>C RNA methyltransferase. Due to the nitrogen substitution at the C5 position, a stable covalent bond forms when the RNA methyltransferase attacks the C6 position of its RNA targets. These targets are enriched by immunoprecipitation and subsequently sequenced (Fig. 3c). In addition, a specific C to G transversion could be observed in the targeted cytosine residue, allowing base-resolution detection of m<sup>5</sup>C sites. Using this approach, the direct targets of NSUN2 and DNMT2 have been identified in a transcriptome-wide manner, by two independent experiments<sup>55</sup>. Yet, m<sup>5</sup>C sites that are not replaced by 5-azacytidine will be missed in this method. The other approach also exploits the catalytic mechanisms of the m<sup>5</sup>C methyltransferase: the cysteine-to-alanine mutation (C271A) in the human NSUN2 protein inhibits the release of the enzyme from the protein-RNA complex, resulting in a stable covalent bond between NSun2 and its RNA targets<sup>56</sup>. Combining this strategy with CLIP (without UV), the method called miCLIP

(methylation iCLIP) successfully identifies the targets of NSUN2 in the transcriptome<sup>56</sup> (**Fig. 3d**). These two approaches can identify the direct targets and are not affected by potential redundancy of different methyltransferases. In addition, the immunoprecipitation procedures allow detection of low-abundance methylated RNAs without the requirement of extremely deep sequencing.

hm<sup>5</sup>dC in DNA is generated by oxidation of m<sup>5</sup>dC mediated by the TET protein and is now established as an important epigenetic marker<sup>57,58</sup>. This m<sup>5</sup>dC oxidation prompted the question of whether oxidation derivatives of m<sup>5</sup>C are present in RNA<sup>59</sup>. In fact, hm<sup>5</sup>C was first found in the rRNA of wheat seedlings in 1978 (ref. 60). Recently, both mammalian and Drosophila TET proteins have been shown to oxidize m<sup>5</sup>C to hm<sup>5</sup>C (refs. 61 and 62); isotope-tracing experiments have also demonstrated that m5C in RNA can be oxidatively metabolized into hm<sup>5</sup>C and 5-formylcytidine<sup>63</sup> (Supplementary Table 1). In 2016, a method called 'hMeRIP-seq', which uses an hm5C-specific antibody, was developed to map hm<sup>5</sup>C in the transcriptome<sup>61</sup>. Applying hMeRIP-seq to S2 cells, over 3,000 hm<sup>5</sup>C peaks have been identified in the Drosophila melanogaster transcriptome<sup>61</sup>. Many hm<sup>5</sup>C peaks are located in the coding sequences; this distribution pattern is different from that of m<sup>5</sup>C (Supplementary Table 1), suggesting that hm<sup>5</sup>C and m<sup>5</sup>C have different roles. Yet, base-resolution methods for hm<sup>5</sup>C detection remain unexplored. For hm<sup>5</sup>dC on DNA, two quantitative, base-resolution methods are available<sup>64,65</sup>. TAB-seq first protects hm<sup>5</sup>dC with enzyme-mediated glucosylation, and then uses a TET enzyme to 'remove' m<sup>5</sup>dC, thereby detecting hm<sup>5</sup>dC with bisulfite conversion. oxBS-seq utilizes KRuO<sub>4</sub> to selectively oxidize hm<sup>5</sup>dC, thereby distinguishing hm<sup>5</sup>dC from m<sup>5</sup>dC during bisulfite treatment. It remains to be seen whether these methods are suitable for hm<sup>5</sup>C detection on RNA, since they rely on bisulfite treatment. In addition, the beta-glucosyltransferase might not work as efficiently in ssRNA as in dsDNA; and KRuO<sub>4</sub>-mediated oxidation might react to the 2'-hydroxyl group of ribonucleotides.

#### Inosine, stringent bioinformatics and orthogonal approaches

Adenosine-to-inosine (A-to-I) editing is the most prevalent type of RNA editing in higher eukaryotes and can be catalyzed by the dsRNA-



Figure 4 | ICE-seq.

specific adenosine deaminases acting on RNA (ADARs)<sup>66–68</sup>. ADARs have a preference for dsRNA, and A-to-I editing frequently occurs in *Alu* elements in untranslated regions and introns<sup>69,70</sup>. A-to-I editing plays numerous roles in modulating gene expression, including recoding codons, altering alternative splicing and regulating miRNA biogenesis and function<sup>71</sup>.

Inosine provides one example in which the base-pairing property of the modified base differs from that of the original one. Inosine pairs with cytidine, rather than adenosine, in RT and is thus read as guanosine in cDNA. Hence, one strategy to identify A-to-I editing sites is to detect the A-to-G mismatch sites by analyzing cDNA sequences and the corresponding genomic sequences. The major challenge for this strategy is the background noise caused by single nucleotide polymorphisms (SNPs), somatic mutations, pseudogenes and sequencing errors<sup>71</sup>. Thus, initially only sites that are within potential dsRNA regions were considered in order to minimize such noise<sup>69,70,72</sup>. In 2009, using massively parallel target capture and DNA sequencing, an unbiased method was developed that allowed the identification of ~36,000 editing candidates that are residing outside of the repetitive sequences<sup>73</sup>. Although the idea of inosine identification by comparing genomic DNA and RNA sequencing data from the same individuals may sound simple, in reality it can be complicated by many factors, including improper bioinformatics<sup>74–77</sup>. Fortunately, several groups subsequently developed different computational approaches, allowing high-confidence identification of the editing sites in the whole transcriptome<sup>78-81</sup>. This is a typical example of the paramount importance of strict and robust computational pipelines to the detection of RNA

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modifications. More recently, a method that detects inosine sites based only on RNA-seq data from multiple samples has been developed. This method takes advantage of the multitude of publicly available RNA-seq data and thus does not require deep sequencing of both the transcriptome and the genome from the same individual<sup>82</sup>.

As the conventional approach for detecting A-to-G mismatch sites could be complicated by many factors, an alternative chemical labeling method, inosine chemical erasing (ICE), was developed in 2010 (ref. 83). In this approach, acrylonitrile is used to selectively react with inosines in RNA, forming N<sup>1</sup>-cyanoethylinosine (ce<sup>1</sup>I). Because ce<sup>1</sup>I stalls RT and results in truncation of the cDNA, inosine-containing RNA is 'eliminated', while only unmodified RNA gives rise to full length cDNA. By comparing Sanger sequencing results of treated and untreated RNA samples in parallel, the A-to-I editing sites can be detected. In 2014, the ICE method was further coupled to highthroughput sequencing, giving ICE-seq<sup>84</sup> (Fig. 4). The ICE-seq method conducts an unbiased genome-wide screening of A-to-I editing sites and has been applied to the transcriptome of the adult human brain. The ICE-seq method is also a good example of using orthogonal technologies to allow high-confidence mapping of RNA modifications of great interest and intense studies.

#### Pseudouridine, an abundant internal mRNA modification

 $\Psi$ , or the fifth nucleotide of RNA, is overall the most abundant modification and is widespread in stable ncRNAs including rRNA, tRNA and snRNA<sup>85</sup>.  $\Psi$  is generated via isomerization of uridine, catalyzed by two distinct mechanisms: the RNA-dependent mechanism with the box H/ACA ribonucleoproteins and the RNA-independent mechanism with the 'stand-alone'  $\Psi$  synthases<sup>86–88</sup>. In these abundant ncRNAs,  $\Psi$  plays important roles in regulating their function. For instance,  $\Psi$  is required for proper folding of rRNA and for ensuring its translational fidelity<sup>89–91</sup>; in tRNA  $\Psi$  can stabilize the RNA structure, and in snRNA it can affect snRNP biogenesis and mRNA, although the biological function of such mRNA pseudouridylation remains enigmatic. Nevertheless,  $\Psi$  is abundant in mammalian mRNA, with a  $\Psi/U$  ratio of about 0.2–0.6% in human cells and mouse tissues (**Supplementary Table 1**).

Compared to uridine,  $\Psi$  has an additional hydrogen bond donor and a more stable C-C bond; however, these features do not change the Watson–Crick base pairing property of  $\Psi$ , making it impossible to distinguish  $\Psi$  from U by direct sequencing. To distinguish  $\Psi$  from U, a specific chemical labeling approach was developed<sup>92</sup>, relying on a chemical called N-cyclohexyl-N'-b-(4-methylmorpholinium) ethylcarbodiimide metho-p-toluene- sulfonate (CMCT). As the CMC- $\Psi$ adduct stalls RT and terminates the cDNA one nucleotide 3' to it, this reaction was used to detect  $\Psi$  sites in rRNA at single-base resolution in a primer extension assay<sup>93</sup>. However, the primer extension assay relies on prior knowledge of candidate  $\Psi$ -containing regions and is more suited for  $\Psi$  detection at specific loci. Recently, several approaches have been developed to map  $\Psi$  sites in a transcriptome-wide manner by coupling this selective labeling reaction to high-throughput sequencing<sup>94–97</sup>. In  $\Psi$ -Seq, Pseudo-seq and PSI-seq, fragmented mRNA is reacted with CMCT, and the precise  $\Psi$  positions are identified in the transcriptome-wide manner<sup>94–96</sup> (Fig. 5a). These methods have identified ~50–100  $\Psi$  sites in yeast mRNA and ~100–400 sites in human mRNA. Our group also developed CeU-seq, in which a chemically synthesized CMC derivative, azido-CMC (N<sub>3</sub>-CMC), is used. After selective chemical labeling of  $\Psi$ , we conjugated a biotin



**Figure 5** | Transcriptome-wide profiling of  $\Psi$  in the eukaryotic cells. (a)  $\Psi$ -Seq, PSI-Seq and Pseudo-Seq. (b) CeU-Seq.

molecule to the  $\Psi$ -containing RNA, allowing biotin pulldown and pre-enrichment of  $\Psi$ -containing RNA before sequencing<sup>97</sup> (**Fig. 5b**). Because of the pre-enrichment procedure,  $\Psi$  sites of the relative low-abundance mRNA molecules can be detected. Using CeU-seq, thousands of  $\Psi$  sites have been identified in the human and mouse transcriptomes.

A previous comparison of mRNA pseudouridylation events in yeast has reported limited overlap among different studies98. Instead of reevaluating the yeast data, we compared the  $\Psi$  profiles in the human transcriptome identified by  $\Psi$ -seq, Pseudo-seq and CeU-seq. To allow fair comparison, we reanalyzed the sequencing data from the three studies using the same bioinformatics algorithm. We found that the overlap between  $\Psi$ -seq and Pseudo-seq data can be readily increased from ~13% (directly using the reported  $\Psi$  sites) to ~41%, suggesting the use of different bioinformatics cutoffs could underestimate the overlap between data sets. Moreover, ~51% and ~69% of  $\Psi$  sites identified by  $\Psi$ -seq and Pseudo-seq, respectively, can be found in the more comprehensive  $\Psi$  profiles of CeU-seq. In fact, the use of the same computational standard has also been shown to improve the consistency of m<sup>6</sup>A-seq and MeRIP-seq data<sup>3</sup>. In addition, it has been shown that mRNA pseudouridylation is tissue specific<sup>97</sup>, hence factors other than bioinformatics algorithms also need to be considered when comparing the profiles of RNA modifications. Three different human cell lines were used by  $\Psi$ -seq, Pseudo-seq and CeU-seq; given that there are 13 pseudouridine synthases in mammals, the differential expression pattern of these enzymes in cell lines and tissues is very likely to result in context-dependent pseudouridylation events.

While these first methods successfully reveal the widespread and dynamic nature of mRNA pseudouridylation in eukaryotic cells, several improvements could be made to further enhance transcriptome-wide  $\Psi$  profiling. First, all existing methods rely on the RT stops caused by CMC- $\Psi$  adducts to detect  $\Psi$ s at single-base resolution. If optimized RT conditions that allow misincorporation-containing readthrough events—instead of RT stops at CMC- $\Psi$  adducts—could

be identified, such mutational profiles could be an alternative strategy for  $\Psi$  detection<sup>93</sup>. Compared to RT stops, readthrough events are expected to make better use of sequencing reads and increase signalto-noise ratio (by reducing potential bias resulted from fragmentation, ligation and secondary structures). Second, in order to achieve specificity, CMC-mediated labeling of  $\Psi$  is neither complete nor quantitative. New chemicals that can react with  $\Psi$  more efficiently may allow transcriptome-wide quantification<sup>99,100</sup>; and such chemicals could also be azido derivatized to further increase the confidence of  $\Psi$  detection, similar to the use of both CIMS and/or CITS and m<sup>6</sup>A peaks in miCLIP.

#### m<sup>1</sup>A, new adenosine methylation in eukaryotic mRNA

m<sup>1</sup>A is prevalent in tRNA and rRNA<sup>1</sup>. In tRNA, m<sup>1</sup>A methylation at position 58 is catalyzed by TRMT6 and the TRMT61A complex for cytoplasmic tRNA or by TRMT61B for mitochondrial tRNA<sup>101,102</sup>; and m<sup>1</sup>A methylation plays an important role in stabilizing the tertiary structures of the tRNA molecules<sup>103</sup>. m<sup>1</sup>A at position 9 of metazoan mitochondrial tRNA is catalyzed by Trmt10C, and it can affect tRNA structure folding<sup>104</sup>. In human 28S rRNA, m<sup>1</sup>A is methylated at position 1,322 by RRP8 (also known as NML), and this methylation is necessary for proper rRNA biogenesis<sup>105,106</sup>.

Compared to regular adenosines, m<sup>1</sup>A has an additional methyl group at the Watson-Crick interface. Owing to this structural change, m<sup>1</sup>A can not only lead to the generation of truncated cDNAs but can also cause misincorporation at this site in the readthrough cDNAs  $^{100,105}\!.$  However, using such an intrinsic property of  $m^1A$  to directly detect the transcriptome-wide location of m<sup>1</sup>A will require formidable depth of sequencing and present great challenges for the subsequent bioinformatics analysis. Hence, a pre-enrichment step would be crucial. Early this year, we and others independently reported two technologies (termed 'm<sup>1</sup>A-seq' and 'm<sup>1</sup>A-ID-seq') to map the m<sup>1</sup>A methylome in the eukaryotic transcriptome<sup>107,108</sup>. Both methods rely on a very specific m<sup>1</sup>A antibody to enrich m<sup>1</sup>A-containing RNA, thus combining m<sup>1</sup>A immunoprecipitation and highthroughput sequencing. Additional strategies are employed in both methods to further increase the confidence and resolution of detection. For example, m<sup>1</sup>A-seq takes advantage of a chemical-assisted reaction to convert the RT-interfering m<sup>1</sup>A to the RT-silent m<sup>6</sup>A (ref. 107) (Fig. 6a); while m<sup>1</sup>A-ID-seq utilizes an RNA/DNA demethylase to convert  $m^1A$  into regular A after immunoprecipitation  $^{108}\,(\mbox{Fig.}$ 6b). By comparing the sequencing profiles of the demethylase treated and untreated samples, the high-confidence m<sup>1</sup>A peaks can be identified. Despite these technical differences, the main findings by these two technologies very satisfactorily confirm each other. In addition, given the success of antibody-based single-base and quantitative m<sup>6</sup>A sequencing methods, enhanced m<sup>1</sup>A sequencing technologies are expected in the near future to further aid our functional investigations of this new epitranscriptomic mark.

#### Outlook

Despite these major achievements, there is an unmet biological need for new sequencing technologies. First, there is a lack of orthogonal methods to detect the RNA modifications. Second, methods to allow absolute stoichiometry quantification are still needed. Given the identification and importance of different types of differentially methylated regions (DMRs) in DNA, it is tempting to speculate that differentially modified regions in RNA could also be identified. Third, more robust and sensitive methods that need less input are needed not only

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**Figure 6** | Mapping the m<sup>1</sup>A methylome. (**a**) m<sup>1</sup>A-seq. (**b**) m<sup>1</sup>A-ID-seq.

for biological studies but also for future studies of the physiological roles of the epitranscriptome. Fourth, the spatial relationship of different epitranscriptomic marks within the same transcript is largely unknown. Recently, two single-molecule methods—SMRT sequencing and the Nanopore technology—have demonstrated specific and base-resolution detection of m<sup>6</sup>A in synthetic RNA molecules<sup>3,109</sup>. These single-molecule approaches could potentially be used to detect multiple RNA modifications simultaneously and to address the challenge of epitranscriptomic phasing problems. Fifth, novel sequencing methods are needed to identify new epitranscriptomic marks in a transcriptome-wide manner. For instance, recent approaches based on alkaline hydrolysis or RT pausing have been reported for the detection of 2'-O-methylation in eukaryotic cells<sup>110–115</sup>. With further advancement in technology, transcriptome-wide 2'-O-methylation as well as additional RNA modifications could be detected.

Analogous to histone code in which different histone modifications regulate transcription of genetic information, different RNA modifications may regulate the metabolism and function of RNA in a potential 'RNA code'. Despite the recent boom in the field of epitranscriptomics, our current knowledge regarding the epitranscriptome could be just the tip of the iceberg. We envision that future epitranscriptome sequencing technologies will continue to uncover the complexity of the epitranscriptome and enable functional characterization.

Note: Any Supplementary Information and Source Data files are available in the online version of the paper.

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#### COMPETING FINANCIAL INTERESTS

The authors declare no competing financial interests.

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# Erratum: Epitranscriptome sequencing technologies: decoding RNA modifications

## Xiaoyu Li, Xushen Xiong & Chengqi Yi

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In the version of this article initially published, author affiliation numbers were incorrect. Xiaoyu Li originally had affiliation 1; this has been changed to affiliations 1 and 2. Xushen Xiong originally had affiliations 1 and 2; these have been changed to affiliations 1–3. Chengqi Yi originally had affiliations 1 and 3; these have been changed to affiliations 2 and 4. The error has been corrected in the HTML and PDF versions of the article.