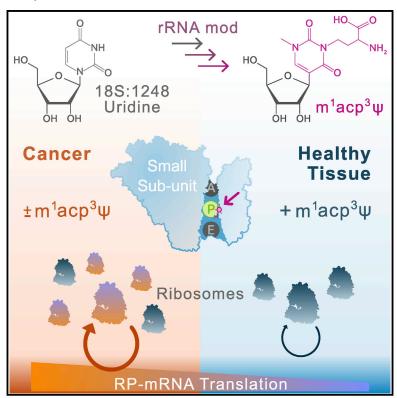
# Loss of $m^1acp^3\Psi$ Ribosomal RNA Modification Is a Major Feature of Cancer

# **Graphical Abstract**



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# In Brief

Babaian et al. discover that the *Eukarya* conserved rRNA hyper-modification  $m^1acp^3\Psi$  is sub-stochiometrically lost in almost half of human colon cancer patients. This disease-specific perturbation at the ribosomal decoding site results in a heterogeneous translational response and may drive tumor proliferation.

# **Highlights**

- 45% of colon cancers sub-stochiometrically lose m<sup>1</sup>acp<sup>3</sup>Ψ ribosomal RNA modification
- 22+ distinct cancer types show hypo-modification of  $m^{1}acp^{3}\Psi$
- The >1-billion-years-conserved  $m^1acp^3\Psi$  is involved in ribosomal P site stability
- Loss of m<sup>1</sup>acp<sup>3</sup>Ψ modification drives heterogenous translation of RP mRNAs







# Report

# Loss of m¹acp³Ψ Ribosomal RNA Modification Is a Major Feature of Cancer

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#### **SUMMARY**

The ribosome is an RNA-protein complex that is essential for translation in all domains of life. The structural and catalytic core of the ribosome is its ribosomal RNA (rRNA). While mutations in ribosomal protein (RP) genes are known drivers of oncogenesis, oncogenic rRNA variants have remained elusive. We identify a cancer-specific single-nucleotide variation in 18S rRNA at nucleotide 1248.U in up to 45.9% of patients with colorectal carcinoma (CRC) and present across >22 cancer types. This is the site of a unique hyper-modified base, 1-methyl-3- $\alpha$ -amino- $\alpha$ -carboxyl-propyl pseudouridine (m¹acp³Ψ), a >1-billion-years-conserved RNA modification at the peptidyl decoding site of the ribosome. A subset of CRC tumors we call hypo-m¹acp³Ψ shows sub-stoichiometric m¹acp³Ψ modification, unlike normal control tissues. An m¹acp³Ψ knockout model and hypo-m¹acp³Ψ patient tumors share a translational signature characterized by highly abundant ribosomal proteins. Thus, m¹acp³Ψ-deficient rRNA forms an uncharacterized class of "onco-ribosome" which may serve as a chemotherapeutic target for treating cancer patients.

#### INTRODUCTION

The ribosome is a massive ribonucleoprotein particle (RNP) responsible for the transformation of genetic information encoded as nucleic acids into functional proteins encoded as amino acids. Unlike most RNPs, it is ribosomal RNA (rRNA) and not ribosomal proteins (RPs) that form the most ancient and catalytic core of the complex (Cech, 2000). rRNA is further functionalized by a constellation of at least 14 distinct chemical modifications across ≥200 sites (Taoka et al., 2016), clustering around active sites of the ribosome (Sloan et al., 2017), yet the function of many rRNA modifications remains unclear.

The human ribosome contains >80 RPs and 4 rRNAs, totaling ~80% of cellular RNA. During the initial human genome sequencing project, ribosomal DNA (rDNA) loci were systematically excluded from the reference genome (Lander et al., 2001), given that a reference sequence of the rRNA gene, *RNA45S*, was available and the 80–800 rDNA copies were believed to be homogeneous (Elder and Turner, 1995). However, there was early evidence for rDNA polymorphism in humans (Kuo et al., 1996; Leffers and Andersen, 1993). Thus, as technology and sequencing consortium projects revolutionized genomics and transcriptomics, our understanding of rDNA variation has lagged.

rDNA sequence variation at the intra- and inter-individual levels has been documented in multiple species, including humans (Bik et al., 2013; Rabanal et al., 2017; Babaian, 2017; Kim et al., 2018; Parks et al., 2018), but the functional implications of rDNA variation remain elusive. Mutations of RP genes and ribosome biogenesis factors can cause a class of diseases called ribosomopathies, including Diamond Blackfan anemia (DBA) (Nakhoul et al., 2014), and some cancers (Goudarzi and Lindström, 2016). It has been hypothesized that cancer cells contain a functionally specialized class of ribosomes to facilitate rapid protein synthesis called the "onco-ribosomes" (Shi and Barna, 2015; Shi et al., 2017; Dinman, 2016). Cancer genomics has supported this notion with the identification of several oncogenic driver mutations in RP genes (Goudarzi and Lindström, 2016), the best characterized of which are RPL10 (uL16) p.R98S in T cell acute lymphoblastic leukemia (Girardi et al., 2018; Kampen et al., 2019) and RPS15 (uS19) C'-terminal mutations in chronic lymphocytic leukemia (Bretones et al., 2018). In addition, germline mutations such as those in DBA patients and in RPS20 can lead to heredity cancers, including colorectal carcinoma (CRC) (Vlachos et al., 2012; Nieminen et al., 2014).

As RP mutations have been implicated in tumorigenesis, we hypothesized that rRNA variation or mutation is a cancer driver. To map functional rRNA sequence variation, we considered



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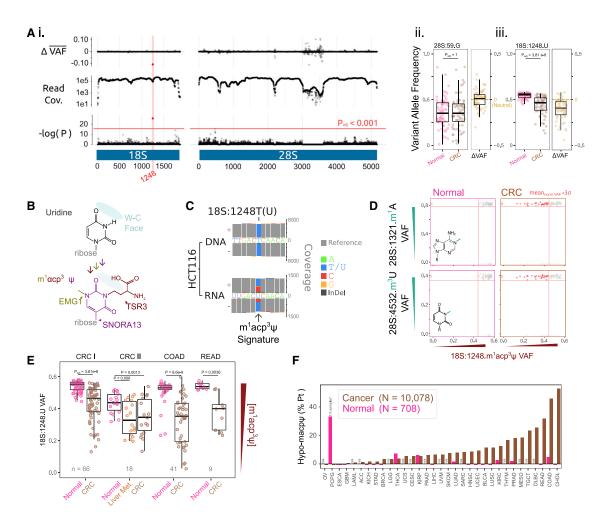


Figure 1. The Hypo-m<sup>1</sup>acp<sup>3</sup>Ψ Phenotype in Cancer

(A) i, screen for change in the average variant allele frequency (VAF) across 18S and 28S ribosomal RNA (rRNA) in colorectal cancer (CRC) RNA-seg compared to patient-matched normal epithelium controls (n = 66). Read coverage and quality drops at extreme GC-content (>90%) regions of 28S; these low-coverage regions were excluded from further analysis. ii, the common human rRNA polymorphism 28S:r.59G>A ranges from 0.05-0.93 (Tukey's boxplot) DNA allele frequency (Babaian, 2017) and was expressed comparably in the normal epithelium between VAFs of 0.01-0.86. Neither allele is directionally selected for during cancer evolution, which is consistent with neutral drift ( $p_{adj} = 1$ , t = -0.44). iii, 18S:r.1248.U is significantly enriched ( $p_{adj} = 3.81e - 8$ , t = 8.33) for the reference U

(B) The 18S:r.1248.U base normally undergoes enzymatic hyper-modification to 1-methyl-3-α-amino-α-carboxyl-propyl pseudouridine (m¹acp³Ψ) in 3 steps; SNORA13-guided pseudouridylation; EMG1 N1-methylation; and finally 3-amino-carboxyl-propylation by TSR3, which are not downregulated in hypo-m<sup>1</sup>acp<sup>3</sup>Ψ tumors (Figure S1D).

(C) Perturbation of the Watson-Crick face of the modified base results in a distinct nucleotide misincorporation signature by reverse transcriptase in first-strand cDNA synthesis, which is read out on both the first (+) and second read pair (-) of sequencing of matched HCT116 whole-genome DNA- and RNA-seq (Cancer Cell Line Encyclopedia, Ghandi et al., 2019).

(D) Patient 18S:r.1248.m<sup>1</sup>acp<sup>3</sup>Ψ hypo-modification is defined as a decrease in VAF by 3 standard deviations (3σ) of the matched-normal samples. Hypo $m^{1}acp^{3}\Psi$  is not correlated with the loss of other rRNA modifications detectable by RNA-seq.

(E) The hypo-m¹acp³Ψ phenotype is replicated in 3 additional independent cohorts of CRC with patient-matched adjacent normal controls, including 2 cohorts from The Cancer Genome Atlas (TCGA), colorectal adenocarcinoma (COAD) cohort, and rectal adenocarcinoma (READ) cohort.

(F) Hypo-modification of 18S:r.1248.m<sup>1</sup>acp<sup>3</sup>Ψ is prevalent but not ubiquitous across the TCGA cancer cohorts (n = 10,078 patients) and largely absent from patient-matched normal controls (n = 708). See also Figure S1.

tumorigenesis as a natural experiment in which polymorphic and mutant rRNA alleles undergo selective evolutionary changes in frequency within each patient. We identify a surprising 18S rRNA single-nucleotide alteration at the decoding core of the ri-

bosomal peptidyl (P) site, affecting up to 45.9% of CRC patients, making this the most frequent ribosomal variant associated with cancer to date and potentially revolutionizing future chemotherapeutic strategies against this disease.

# Report



## **RESULTS AND DISCUSSION**

# An Unexpected rRNA Variant in Cancer: Substoichiometric Modification of 18S.1248.m<sup>1</sup>acp<sup>3</sup>Ψ

In an initial screen for cancer-driver rRNA variants, we aligned RNA sequencing (RNA-seq) reads from 66 CRC tumors and patient-matched adjacent normal tissue to a single-copy reference rDNA. To test for allelic selection that is inconsistent with neutral drift, the patient-matched difference in expressed variant allele frequency (VAF) was measured for deviation from zero for each position of 18S and 28S (Figure 1A). Non-reference reads at a single nucleotide deviated from neutrality, 18S:r.1248.U (padj = 3.81e-8). In this cohort, the 18S.1248.U reference allele is recurrently selected over non-U or 18S.1248V alleles in a striking 44.9% of CRC patients (Figure 1A); in comparison, oncogenic KRAS<sup>G12</sup> codon mutation occurs in only 36% of CRC patients (Tan and Du, 2012).

At the DNA level, the respective nucleotide RNA45S:4908.T is invariable in humans and CRC (Babaian, 2017; Figure S1B), and in the mature rRNA, this uridine undergoes hyper-modification to 1-methyl-3-α-amino-α-carboxyl-propyl pseudouridine  $(m^1acp^3\Psi)$  (Figure 1B) (Taoka et al., 2016). The  $m^1acp^3\Psi$  modification perturbs standard Watson-Crick base pairing during complementary DNA (cDNA) synthesis by reverse transcriptase (RT) (Helm and Motorin, 2017), resulting in base misincorporation and enzyme stalling, which is read out as a consistent "modification signature" in RNA-seq (Figure 1C; reviewed in Helm and Motorin, 2017). Restated, non-reference, or variant reads at 18S.1248.U correspond to  $\text{m}^1\text{acp}^3\Psi$  modification and not a genetic variation. Thus, the increase in the reference U sequence suggests that the m<sup>1</sup>acp<sup>3</sup>Ψ modification is incomplete or sub-stoichiometric in CRC tumors, which we call the hypo $m^1acp^3\Psi$  phenotype. The 28S.1321.m<sup>1</sup>A and 28S.4532.m<sup>3</sup>U rRNA modifications also cause a "modification signature" in RNA-seq (Helm and Motorin, 2017). These modifications do not decrease in CRC tumors or matched normal controls. excluding a non-specific rRNA modification effect (Figure 1D).

The hypo-m<sup>1</sup>acp<sup>3</sup>Ψ phenotype is reproducible at comparable frequencies (27.8%-45.9%) in 3 additional independent patientmatched CRC cohorts (Figures 1E and F). Analysis of 10,036 cancer patients and 712 normal controls across an additional 31 cancer patient cohorts reveals that hypo-m<sup>1</sup>acp<sup>3</sup>Ψ occurs at a significant frequency across a diverse set of cancers but is not pan-cancerous (global recurrence: 9.6%, range: 0%-52.8%) (Figures 1F and S1).

To validate these findings, we designed a simple and rapid aminocarboxyl propyl reverse transcription (aRT)-PCR assay for measuring 18S.1248.m<sup>1</sup>acp<sup>3</sup>Ψ modification. The aRT-PCR is reproducible and quantitative (Figure S2). A critical technical limitation that also applies to RNA-seq is that different RT enzymes or RT reaction chemistries result in different base misincorporation rates at 18S.1248.m<sup>1</sup>acp<sup>3</sup>Ψ (Figure S2D). Thus, cross-cohort or cross-experimental comparisons should be made cautiously (Figures S2B-S2D). Batch effects on VAF are seen within The Cancer Genome Atlas (TCGA) cohorts, yet hypo-m<sup>1</sup>acp<sup>3</sup>Ψ replicates across batches further supports that hypo-m<sup>1</sup>acp<sup>3</sup>Ψ is occurring in tumors specifically (Figures S1C and S1D).

We validated that the hypo-m<sup>1</sup>acp<sup>3</sup> $\Psi$  phenomenon also occurs in CRC cell lines assayed as a single batch and confirmed that the results are not a sequencing artifact (Figure S2E). To test whether m<sup>1</sup>acp<sup>3</sup>Ψ-deficient rRNA incorporate into mature ribosomes, we isolated monosomes and polysomes and detected low m<sup>1</sup>acp<sup>3</sup>Ψ modification levels in mono- and di-somes (Figure S2F).

As the molecular, biological, and medical significance of 18S.1248.m<sup>1</sup>acp<sup>3</sup>Ψ unfolds, it is obvious that genotyping technologies (e.g., sequencing, our aRT-PCR assay for  $m^1acp^3\Psi$ ) and previous  $m^1 a c p^3 \Psi$  assays (e.g., primer extension) can be adapted as affordable and rapid diagnostic/prognostic assays.

# 18S:1248.m<sup>1</sup>acp<sup>3</sup>Ψ Is an Ancient Modification at the **Decoding Core of the P Site**

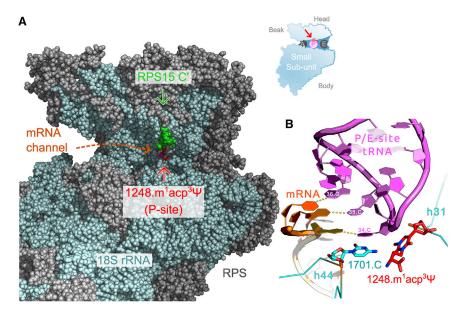
We next investigated the evolutionary and structural characteristics of 18S.1248.m<sup>1</sup>acp<sup>3</sup>Ψ for functional insight. The 18S:1248.U base and  $m^1acp^3\Psi$  modification are absolutely conserved across Eukarya at a residue located in the loop of universal helix 31 (Figures S3A-S3D). TSR3 is the aminocarboxyl propyl transferase that deposits the acp<sup>3</sup> at 18S.1248.U (Meyer et al., 2016), and it only modifies this single rRNA position in 100% of mature rRNA molecules in Eukaryotes (Taoka et al., 2018; Yang et al., 2016).

Structurally, 18S.1248.m<sup>1</sup>acp<sup>3</sup>Ψ is solvent exposed at the ribosomal P site, immediately adjacent to the codon;anti-codon interface (Figure 2). Cryo-EM structures (Li et al., 2019; Natchiar et al., 2017) and our molecular dynamics (MD) simulations implicate the  $m^1acp^3\Psi$  modification in a direct interaction with P site tRNA. The modification carboxyl moiety forms a hydrogen bond with the universally conserved (Jindal et al., 2019) RPS16 p.R146 (Figures S3E-S3G), and transfer RNA (tRNA) interaction is aided by the m<sup>1</sup> modification, which stabilizes the base rotation angle (Figures S3H and S3I). Unlike TSR3, the m<sup>1</sup> transferase of 18S.1248, EMG1, is essential, and its mutation causes Bowen-Conradi syndrome (OMIM: 211180; Armistead et al., 2009; Wurm et al., 2010), supporting the idea that the modification of 18S.1248 plays a crucial role in P site function.

Start AUG codon selection and translational initiation are rate-limiting steps in protein synthesis and both occur at the P site. Thus, the hypo- $m^1acp^3\Psi$  phenotype may demarcate a class of onco-ribosome with deregulated translation. It is noteworthy that the 2 largest effect-size RP cancer-driver mutations also occur at the ribosomal P site-tRNA interface, the RPL10 p.R98S at the peptidyl transfer site (Girardi et al., 2018; Kampen et al., 2019), and the RPS15 C' tail mutations adjacent (<12 Å) to 1248.m<sup>1</sup>acp<sup>3</sup>Ψ (Figure 2A), suggesting that the ribosomal P site is a convergent multi-cancer oncogenic hotspot.

Since the discovery of streptomycin in 1944, the ribosome has been the target of several important classes of drugs (McCoy et al., 2011). The pervasive and recurrent loss of a solvent-exposed and dipole-charged acp3 modification at the decoding core of the small subunit (SSU) raises the possibility that this pocket may be therapeutically exploited with ribosome-targeting antibiotics or their derivatives as a next-generation chemotherapy.





## Figure 2. 18S:1248.m1acp3Ψ Is Located at the Peptidyl (P) Decoding Site

(A) The mRNA channel of the human small subunit (SSU) cryoelectron microscopy (cryo-EM) structure with resolved base modifications (PDB: 6EK0; Natchiar et al., 2017). The  $18S:1248.m^{1}acp^{3}\Psi$ (red) nucleotide is on the loop of the universal helix 31 (see also Figure S3), exposed to the mRNA channel at the center of the P site. The chronic lymphocytic leukemia (CLL) driver mutations in the RPS15 C' tail (green) are <12.8 Å from 18S:1248.m<sup>1</sup>acp<sup>3</sup>Ψ. The minimal distance is likely shorter as the 10 C'-terminal residues of RPS15 that extend into the P site are labile and not modeled.

(B) Cryo-EM structure with a peptidyl/exit (P/E) site tRNA, 18S.1248. Ψ, and 18S.1701.C base stack with the ribose and base of the tRNA.34.C, respectively (PDB: 6OLE; Li et al., 2019). 18S.1248.m¹acp³Ψ modification contributes to P site decoding site stability via interaction with P site tRNA and RPS16.

See also Figures S3E-S3I.

# Loss of 18S.1248.m¹acp³Ψ Modification Induces **Ribosomal Protein mRNA Translation**

To delineate the function of 18S.1248.m<sup>1</sup>acp<sup>3</sup>Ψ, we generated TSR3 knockout (KO) CRC cell lines (HCT116). Similar to yeast (Meyer et al., 2016), TSR3 is non-essential and we isolated 2 TSR3 homozygous KOs (TSR3[KO 1,3]), a heterozygous KO (TSR3[Het 2]) and 3 wild-type (WT) control clones (WT[1-3]). KOs were functionally confirmed by 5 independent m<sup>1</sup>acp<sup>3</sup> $\Psi$ assays and editing sites validated by RNA-seg, with TSR3 [Het 2] showing an intermediate or hypo-m<sup>1</sup>acp<sup>3</sup>Ψ phenotype (Figures 3A, S2G-S2I, and S4). The hypo-m<sup>1</sup>acp<sup>3</sup>Ψ seen in TSR3[Het 2] is more severe than that seen in CRC cell lines (Figure S2E), but comparable to what is observed in CRC patient tumors (Figure S1A), SCARLET shows the presence of the  $\Psi$  and m<sup>1</sup> $\Psi$  precursor bases at 18S.1248 in TSR3[KO 1] cells (Figure S2H). This demonstrates that the loss of the acp<sub>3</sub> modification via TSR3[KO] is necessary for RT-mediated nucleotide misincorporation as measured by RNA-seq, and further supports the possibility that hypo-m<sup>1</sup>acp<sup>3</sup> $\Psi$  tumors contain sub-stoichiometric loss of the acp3 moiety.

Morphologically, the HCT116 clones were indistinguishable and showed that comparable rapid growth, cell-cycle timing, and loss of TSR3 did not alter global protein translation rates (Figures 3B-3D). To determine how the loss of 18S.1248.m<sup>1</sup>acp<sup>3</sup>Ψ modification alters translation, we characterized the transcriptome (RNA-seq) and translatome (ribo-seq) of these cells and validated our findings by global mass spectrometry (Figures S4-S6).

Transcriptionally, gene set enrichment analysis (GSEA) revealed that TSR3[KO]/[Het] (versus WT) cells were dominated by a proliferative tumor expression signature, characterized by Rb-depletion and/or elevated-E2F transcription factor activity (Figures 3E and S5H; Table S1C). However, TSR3[KO]/[Het] cells also have a paradoxical decrease in translation of the same E2F target genes

(Figure S5), stressing the specificity of using RNA-expression gene-set classifiers.

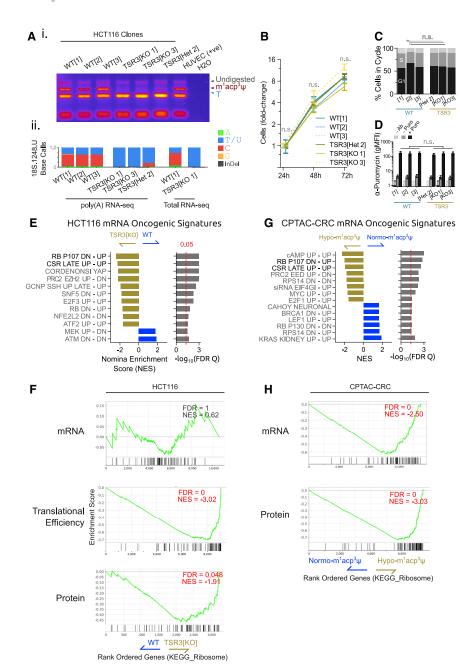
To determine how the loss of the 18S.1248.m<sup>1</sup>acp<sup>3</sup>Ψ modification alters translation, we contrasted translational efficiency between genotypes. TSR3[KO]/[Het] cells showed a remarkable enrichment (versus WT) in the translation of RPs, such as RPS8 and RPL4, with an associated depletion of RP mRNA (Figures 3F, S5, and S6), yet overall translation rates and polysome profiles of TSR3[KO]/[Het] cells were not altered (Figures 3D and S6E).

To validate whether this RP mRNA-protein signature is present in cancer patients, we analyzed the Clinical Proteomic Tumor Analysis Consortium (CPTAC)-CRC cohort with tumor-matched RNA-seg and proteomics data (Vasaikar et al., 2019). Similar to TSR3[KO]/[Het] cell lines, hypo-m<sup>1</sup>acp<sup>3</sup>Ψ CRC tumors share the same E2F/RB oncogenic gene signature and a proteomic increase in RPs relative to normo-m¹acp³Ψ CRC tumor controls (Figures 3G and 3H; Tables S1C-S1E).

There are two hypotheses with which to interpret the hypom<sup>1</sup>acp<sup>3</sup>Ψ phenotype. The "oncogenic driverhypothesis" is that m<sup>1</sup>acp<sup>3</sup>Ψ-deficient rRNA arise in tumorigenesis, and their dysregulated translation confers a selective advantage to the cancer, likely via high RP output. The recapitulation of the TSR3[KO]/[Het] multi-omic phenotype in hypo-m<sup>1</sup>acp<sup>3</sup>Ψ CRC patients supports this causal model. The "passenger hypothesis" is that  $m^1acp^3\Psi$  deficiency arises as a consequence of hyper-proliferation and high ribosomal biogenesis. Rapid cellular turnover (often associated with upregulated E2F1 activity) in turn results in the incomplete modification of rRNA. In this model, the consequences of m<sup>1</sup>acp<sup>3</sup>Ψ-deficient rRNA are near-neutral or tolerably detrimental to tumor fitness. Nevertheless, hypo-m<sup>1</sup>acp<sup>3</sup> $\Psi$  is a highly recurrent perturbation to the ancient peptidyldecoding core and underlies a greater cancer-translational phenomenon.

# Report





# Loss of m<sup>1</sup>acp<sup>3</sup>Ψ rRNA Modification Is a Major Feature

Ribosomes are the fulcrum in the central dogma of molecular biology. Multi-omics studies have repeatedly highlighted the discordance between mRNA and protein abundance (Liu et al., 2016; Vogel and Marcotte, 2012), emphasizing the role of translational variability in physio-normal and pathological states. Several recent studies have begun to resolve the ribosome from a uniform assembly into a rich tapestry of functionally heterogeneous complexes making up distinct translational compartments in the cell (Dinman, 2016; Slavov et al., 2015; Xue et al., 2015; Shi et al., 2017; Fujii et al., 2018). Spe-

# Figure 3. The Translational Signature of m¹acp³Ψ-Deficient Ribosomes

- (A) i, aminocarboxyl propyl reverse transcription (aRT)-PCR assay (see STAR Methods and Figure S2) and ii, RNA-seq measurement for nucleotide misincorporation at 18S:1248.m<sup>1</sup>acp<sup>3</sup>Ψ in independent clones (biological replicates) of the CRC HCT116 cell line, with human umbilical vein endothelial cells (HUVEC) as a normal positive control.
- (B) The fold-change growth (mean +/- standard deviation) of HCT116 clone populations in culture, normalized to cell number at 24 h.
- (C) Cell-cycle timing analysis of log-growth HCT116 cell genotypes.
- (D) Total protein translation rates measured by puromycin-incorporation assay and flow cytometry quantification reported as the geometric mean fluorescent intensity (gMFI).
- (E) Summary of significant (false discovery rate q value < 0.05) gene set enrichment analysis (GSEA) of RNA-seg comparing HCT116 WT[1-3] versus HCT116 TSR3[KO 1,3/Het 2] clones.
- (F) TSR3[KO/Het] cell GSEA shows no change in ribosomal protein (RP) mRNA abundance, while RP translational efficiency and total protein in-
- (G and H) Summary of oncogenic signature GSEA comparing CPTAC CRC tumors with normo $m^{1}acp^{3}\Psi$  and hypo- $m^{1}acp^{3}\Psi$  modification (G). Gene sets common to HCT116 TSR3[KO]/[Het] and hypo-m<sup>1</sup>acp<sup>3</sup> CPTAC-CRC patients are bold and (H) a similar increase in RP abundance is observed

See also Figures S4-S6 and Tables S1C-S1E.

cifically, several rRNA modifications such as pseudouridylation (Ruggero et al., 2003; Jack et al., 2011; Penzo et al., 2015; Sbarrato et al., 2016; McMahon et al., 2019), ribose 2'-Omethylation (Marcel et al., 2013; Krogh et al., 2016), and C5-methyl cytosine (Heissenberger et al., 2019) have been implicated in altering the translational capacity of cancer cells (reviewed in Jonkhout et al., 2017; Bastide and David, 2018). Together with  $m^1acp^3\Psi$ , this supports a broader view of rRNA

as a central oncogene, perturbed not genetically, but at the epigenetic modification level.

The variable and sub-stochiometric loss of  $m^1acp^3\Psi$  in cancer is noteworthy and suggests that a sub-fraction of the ribosomes of a cancer cell are affected. Furthermore, the loss of 18S.1248 acp3 modification altered the translation of only a subset of (RP) mRNA. This suggests that the molecular and possibly tumorigenic function of acp<sup>3</sup> modification is mediated within a distinct class of ribosome, although further research is needed to resolve this mechanism.

We identify a pervasive and cancer-specific onco-ribosome marked by the loss of rRNA  $m^1acp^3\Psi$  modification. The





cancer-specific m¹acp³Ψ-deficient ribosomes have exceptional recurrence and can be explored as a chemotherapeutic target.

#### **STAR**\*METHODS

Detailed methods are provided in the online version of this paper and include the following:

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## SUPPLEMENTAL INFORMATION

Supplemental Information can be found online at https://doi.org/10.1016/j. celrep.2020.107611.

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## **AUTHOR CONTRIBUTIONS**

A.B. initially characterized hypo- $m^1acp^3\Psi$ , led the study, and performed DNAand RNA-seq analysis. A.B. and K.R. performed molecular and cell culture experiments. A.B. invented the aRT-PCR assay for  $m^1acp^3\Psi$ . S.D. performed the primer extension and the aRT-PCR optimization. D.G. performed the molecular dynamics simulations and H.-J.W. and A.B. helped analyze the data. I.M. prepared the ribo-seq libraries, performed SCARLET validation, and invented the aminocarboxyl propyl biotinylation method. A.B. and M.M. processed and analyzed the ribo-seq data. S.E.S.M. performed the liquid chromatographytandem mass spectrometry (LC-MS/MS). H.-J.W., M.L., G.B.M., and D.L.M. provided expert advice for the experiments. All of the authors contributed to the design of the study. A.B. prepared the manuscript and figures.

#### **DECLARATION OF INTERESTS**

The authors declare no competing interests.

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#### **REFERENCES**

Armistead, J., Khatkar, S., Meyer, B., Mark, B.L., Patel, N., Coghlan, G., Lamont, R.E., Liu, S., Wiechert, J., Cattini, P.A., et al. (2009). Mutation of a gene essential for ribosome biogenesis, EMG1, causes Bowen-Conradi syndrome. Am. J. Hum. Genet. 84, 728-739.

Babaian, A. (2017). Intra- and Inter-individual genetic variation in human ribosomal RNAs. bioRxiv. https://doi.org/10.1101/118760.

Bastide, A., and David, A. (2018). The ribosome, (slow) beating heart of cancer (stem) cell. Oncogenesis 7, 34.

Best, R.B., Zhu, X., Shim, J., Lopes, P.E.M., Mittal, J., Feig, M., and Mackerell, A.D., Jr. (2012). Optimization of the additive CHARMM all-atom protein force field targeting improved sampling of the backbone  $\varphi,\,\psi$  and side-chain  $\chi(1)$ and  $\chi(2)$  dihedral angles. J. Chem. Theory Comput. 8, 3257–3273.

Bik, H.M., Fournier, D., Sung, W., Bergeron, R.D., and Thomas, W.K. (2013). Intra-genomic variation in the ribosomal repeats of nematodes. PLoS One 8, e78230.

Bretones, G., Álvarez, M.G., Arango, J.R., Rodríguez, D., Nadeu, F., Prado, M.A., Valdés-Mas, R., Puente, D.A., Paulo, J.A., Delgado, J., et al. (2018). Altered patterns of global protein synthesis and translational fidelity in RPS15-mutated chronic lymphocytic leukemia. Blood 132, 2375–2388.

Cech, T.R. (2000). Structural biology. The ribosome is a ribozyme. Science 289, 878-879.

Danecek, P., Auton, A., Abecasis, G., Albers, C.A., Banks, E., DePristo, M.A., Handsaker, R.E., Lunter, G., Marth, G.T., Sherry, S.T., et al.; 1000 Genomes Project Analysis Group (2011). The variant call format and VCFtools. Bioinformatics 27, 2156-2158.

Denning, E.J., Priyakumar, U.D., Nilsson, L., and Mackerell, A.D., Jr. (2011). Impact of 2'-hydroxyl sampling on the conformational properties of RNA: update of the CHARMM all-atom additive force field for RNA. J. Comput. Chem. 32, 1929-1943.

# Report



Dinman, J.D. (2016). Pathways to Specialized Ribosomes: The Brussels Lecture. J. Mol. Biol. 428 (10 Pt B), 2186-2194.

Dobin, A., Davis, C.A., Schlesinger, F., Drenkow, J., Zaleski, C., Jha, S., Batut, P., Chaisson, M., and Gingeras, T.R. (2013). STAR: ultrafast universal RNA-seq aligner. Bioinformatics 29, 15-21.

Elder, J.F., Jr., and Turner, B.J. (1995). Concerted evolution of repetitive DNA sequences in eukaryotes. Q. Rev. Biol. 70, 297-320.

Floor, S.N., and Doudna, J.A. (2016). Tunable protein synthesis by transcript isoforms in human cells. eLife 5, e10921.

Frankish, A., Diekhans, M., Ferreira, A.-M., Johnson, R., Jungreis, I., Loveland, J., Mudge, J.M., Sisu, C., Wright, J., Armstrong, J., et al. (2019). GENCODE reference annotation for the human and mouse genomes. Nucleic Acids Res. 47 (D1), D766-D773.

Friedman, S. (1972). Acylation of transfer ribonucleic acid with the N-hydroxysuccinimide ester of phenoxyacetic acid. Biochemistry 11, 3435-3443.

Fujii, K., Susanto, T.T., Saurabh, S., and Barna, M. (2018). Decoding the Function of Expansion Segments in Ribosomes. Mol. Cell 72, 1013-1020.e6.

Ghandi, M., Huang, F.W., Jané-Valbuena, J., Kryukov, G.V., Lo, C.C., McDonald, E.R., 3rd, Barretina, J., Gelfand, E.T., Bielski, C.M., Li, H., et al. (2019). Next-generation characterization of the Cancer Cell Line Encyclopedia. Nature 569, 503-508.

Gillam, I., Blew, D., Warrington, R.C., von Tigerstrom, M., and Tener, G.M. (1968). A general procedure for the isolation of specific transfer ribonucleic acids. Biochemistry 7, 3459-3468.

Girardi, T., Vereecke, S., Sulima, S.O., Khan, Y., Fancello, L., Briggs, J.W., Schwab, C., de Beeck, J.O., Verbeeck, J., Royaert, J., et al. (2018). The Tcell leukemia-associated ribosomal RPL10 R98S mutation enhances JAK-STAT signaling. Leukemia 32, 809-819.

Girodat, D., Mercier, E., Gzyl, K.E., and Wieden, H.-J. (2019). Elongation Factor Tu's Nucleotide Binding Is Governed by a Thermodynamic Landscape Unique among Bacterial Translation Factors. J. Am. Chem. Soc. 141, 10236–10246.

Goudarzi, K.M., and Lindström, M.S. (2016). Role of ribosomal protein mutations in tumor development (Review). Int. J. Oncol. 48, 1313-1324.

Heissenberger, C., Liendl, L., Nagelreiter, F., Gonskikh, Y., Yang, G., Stelzer, E.M., Krammer, T.L., Micutkova, L., Vogt, S., Kreil, D.P., et al. (2019). Loss of the ribosomal RNA methyltransferase NSUN5 impairs global protein synthesis and normal growth. Nucleic Acids Res. 47, 11807-11825.

Helm, M., and Motorin, Y. (2017). Detecting RNA modifications in the epitranscriptome: predict and validate. Nat. Rev. Genet. 18, 275-291.

Humphrey, W., Dalke, A., and Schulten, K. (1996). VMD: visual molecular dynamics. J. Mol. Graph. 14, 33-38, 27-28.

Ingolia, N.T., Brar, G.A., Rouskin, S., McGeachy, A.M., and Weissman, J.S. (2012). The ribosome profiling strategy for monitoring translation in vivo by deep sequencing of ribosome-protected mRNA fragments. Nat. Protoc. 7, 1534-1550.

Jack, K., Bellodi, C., Landry, D.M., Niederer, R.O., Meskauskas, A., Musalgaonkar, S., Kopmar, N., Krasnykh, O., Dean, A.M., Thompson, S.R., et al. (2011). rRNA pseudouridylation defects affect ribosomal ligand binding and translational fidelity from yeast to human cells. Mol. Cell 44, 660-666.

Jindal, S., Ghosh, A., Ismail, A., Singh, N., and Komar, A.A. (2019). Role of the uS9/yS16 C-terminal tail in translation initiation and elongation in Saccharomyces cerevisiae. Nucleic Acids Res. 47, 806-823.

Jonkhout, N., Tran, J., Smith, M.A., Schonrock, N., Mattick, J.S., and Novoa, E.M. (2017). The RNA modification landscape in human disease. RNA 23, 1754-1769

Kampen, K.R., Sulima, S.O., Verbelen, B., Girardi, T., Vereecke, S., Rinaldi, G., Verbeeck, J., Op de Beeck, J., Uyttebroeck, A., Meijerink, J.P.P., et al. (2019). The ribosomal RPL10 R98S mutation drives IRES-dependent BCL-2 translation in T-ALL. Leukemia 33, 319-332.

Kim, J.-H., Dilthey, A.T., Nagaraja, R., Lee, H.-S., Koren, S., Dudekula, D., Wood Iii, W.H., Piao, Y., Ogurtsov, A.Y., Utani, K., et al. (2018). Variation in human chromosome 21 ribosomal RNA genes characterized by TAR cloning and long-read sequencing. Nucleic Acids Res. 46, 6712-6725.

Kim, D., Pertea, G., Trapnell, C., Pimentel, H., Kelley, R., and Salzberg, S.L. (2013). TopHat2: accurate alignment of transcriptomes in the presence of insertions, deletions and gene fusions. Genome Biol. 14, R36.

Krogh, N., Jansson, M.D., Häfner, S.J., Tehler, D., Birkedal, U., Christensen-Dalsgaard, M., Lund, A.H., and Nielsen, H. (2016). Profiling of 2'-O-Me in human rRNA reveals a subset of fractionally modified positions and provides evidence for ribosome heterogeneity. Nucleic Acids Res. 44, 7884–7895.

Kuo, B.A., Gonzalez, I.L., Gillespie, D.A., and Sylvester, J.E. (1996). Human ribosomal RNA variants from a single individual and their expression in different tissues. Nucleic Acids Res. 24, 4817-4824.

Lander, E.S., Linton, L.M., Birren, B., Nusbaum, C., Zody, M.C., Baldwin, J., Devon, K., Dewar, K., Doyle, M., FitzHugh, W., et al.; International Human Genome Sequencing Consortium (2001). Initial sequencing and analysis of the human genome. Nature 409, 860-921.

Langmead, B., and Salzberg, S.L. (2012). Fast gapped-read alignment with Bowtie 2. Nat. Methods 9, 357-359.

Lauria, F., Tebaldi, T., Bernabò, P., Groen, E.J.N., Gillingwater, T.H., and Viero, G. (2018). riboWaltz: Optimization of ribosome P-site positioning in ribosome profiling data. PLoS Comput. Biol. 14, e1006169.

Leffers, H., and Andersen, A.H. (1993). The sequence of 28S ribosomal RNA varies within and between human cell lines. Nucleic Acids Res. 21, 1449-1455.

Li, H., Handsaker, B., Wysoker, A., Fennell, T., Ruan, J., Homer, N., Marth, G., Abecasis, G., and Durbin, R.; 1000 Genome Project Data Processing Subgroup (2009). The Sequence Alignment/Map format and SAMtools. Bioinformatics 25, 2078-2079.

Li, W., Ward, F.R., McClure, K.F., Chang, S.T.-L., Montabana, E., Liras, S., Dullea, R.G., and Cate, J.H.D. (2019). Structural basis for selective stalling of human ribosome nascent chain complexes by a drug-like molecule. Nat. Struct, Mol. Biol. 26, 501-509.

Liberzon, A., Birger, C., Thorvaldsdóttir, H., Ghandi, M., Mesirov, J.P., and Tamayo, P. (2015). The Molecular Signatures Database (MSigDB) hallmark gene set collection. Cell Syst. 1, 417-425.

Lim, B., Mun, J., Kim, J.-H., Kim, C.W., Roh, S.A., Cho, D.-H., Kim, Y.S., Kim, S.-Y., and Kim, J.C. (2015). Genome-wide mutation profiles of colorectal tumors and associated liver metastases at the exome and transcriptome levels. Oncotarget 6, 22179-22190.

Liu, Y., Beyer, A., and Aebersold, R. (2016). On the Dependency of Cellular Protein Levels on mRNA Abundance. Cell 165, 535-550.

Liu, N., Parisien, M., Dai, Q., Zheng, G., He, C., and Pan, T. (2013). Probing N6methyladenosine RNA modification status at single nucleotide resolution in mRNA and long noncoding RNA. RNA 19, 1848-1856.

Love, M.I., Huber, W., and Anders, S. (2014). Moderated estimation of fold change and dispersion for RNA-seq data with DESeq2. Genome Biol. 15, 550.

Marcel, V., Ghayad, S.E., Belin, S., Therizols, G., Morel, A.-P., Solano-Gonzàlez, E., Vendrell, J.A., Hacot, S., Mertani, H.C., Albaret, M.A., et al. (2013). p53 acts as a safeguard of translational control by regulating fibrillarin and rRNA methylation in cancer. Cancer Cell 24, 318-330.

Masek, T., Vopalensky, V., Suchomelova, P., and Pospisek, M. (2005). Denaturing RNA electrophoresis in TAE agarose gels. Anal. Biochem. 336, 46-50.

McCoy, L.S., Xie, Y., and Tor, Y. (2011). Antibiotics that target protein synthesis. Wiley Interdiscip. Rev. RNA 2, 209-232.

McMahon, M., Contreras, A., Holm, M., Uechi, T., Forester, C.M., Pang, X., Jackson, C., Calvert, M.E., Chen, B., Quigley, D.A., et al. (2019). A single H/ ACA small nucleolar RNA mediates tumor suppression downstream of oncogenic RAS. eLife 8, e48847.

Mellacheruvu, D., Wright, Z., Couzens, A.L., Lambert, J.-P., St-Denis, N.A., Li, T., Miteva, Y.V., Hauri, S., Sardiu, M.E., Low, T.Y., et al. (2013). The CRAPome: a contaminant repository for affinity purification-mass spectrometry data. Nat. Methods 10, 730-736.



Meyer, B., Wurm, J.P., Sharma, S., Immer, C., Pogoryelov, D., Kötter, P., Lafontaine, D.L.J., Wöhnert, J., and Entian, K.-D. (2016). Ribosome biogenesis factor Tsr3 is the aminocarboxypropyl transferase responsible for 18S rRNA hypermodification in yeast and humans. Nucleic Acids Res. 44, 4304–4316.

Nakhoul, H., Ke, J., Zhou, X., Liao, W., Zeng, S.X., and Lu, H. (2014). Ribosomopathies: mechanisms of disease. Clin. Med. Insights Blood Disord. 7, 7–16. Natchiar, S.K., Myasnikov, A.G., Kratzat, H., Hazemann, I., and Klaholz, B.P. (2017). Visualization of chemical modifications in the human 80S ribosome structure. Nature 551, 472-477.

Nieminen, T.T., O'Donohue, M.-F., Wu, Y., Lohi, H., Scherer, S.W., Paterson, A.D., Ellonen, P., Abdel-Rahman, W.M., Valo, S., Mecklin, J.-P., et al. (2014). Germline mutation of RPS20, encoding a ribosomal protein, causes predisposition to hereditary nonpolyposis colorectal carcinoma without DNA mismatch repair deficiency. Gastroenterology 147, 595-598.e5.

Parks, M.M., Kurylo, C.M., Dass, R.A., Bojmar, L., Lyden, D., Vincent, C.T., and Blanchard, S.C. (2018). Variant ribosomal RNA alleles are conserved and exhibit tissue-specific expression. Sci. Adv. 4, eaao0665.

Penzo, M., Rocchi, L., Brugiere, S., Carnicelli, D., Onofrillo, C., Couté, Y., Brigotti, M., and Montanaro, L. (2015). Human ribosomes from cells with reduced dyskerin levels are intrinsically altered in translation. FASEB J. 29, 3472-3482.

Pertea, M., Pertea, G.M., Antonescu, C.M., Chang, T.-C., Mendell, J.T., and Salzberg, S.L. (2015). StringTie enables improved reconstruction of a transcriptome from RNA-seq reads. Nat. Biotechnol. 33, 290-295.

Phillips, J.C., Braun, R., Wang, W., Gumbart, J., Tajkhorshid, E., Villa, E., Chipot, C., Skeel, R.D., Kalé, L., and Schulten, K. (2005). Scalable molecular dynamics with NAMD. J. Comput. Chem. 26, 1781-1802.

R Development Core Team (2018). R: A language and environment for statistical computing (R Foundation for Statistical Computing).

Rabanal, F.A., Nizhynska, V., Mandáková, T., Novikova, P.Y., Lysak, M.A., Mott, R., and Nordborg, M. (2017). Unstable Inheritance of 45S rRNA Genes in Arabidopsis thaliana. G3 (Bethesda) 7, 1201-1209.

Ruggero, D., Grisendi, S., Piazza, F., Rego, E., Mari, F., Rao, P.H., Cordon-Cardo, C., and Pandolfi, P.P. (2003). Dyskeratosis congenita and cancer in mice deficient in ribosomal RNA modification. Science 299, 259-262.

Sbarrato, T., Horvilleur, E., Pöyry, T., Hill, K., Chaplin, L.C., Spriggs, R.V., Stoneley, M., Wilson, L., Jayne, S., Vulliamy, T., et al. (2016). A ribosomerelated signature in peripheral blood CLL B cells is linked to reduced survival following treatment. Cell Death Dis. 7, e2249.

Schmidt, E.K., Clavarino, G., Ceppi, M., and Pierre, P. (2009). SUnSET, a nonradioactive method to monitor protein synthesis. Nat. Methods 6, 275–277.

Schneider, C.A., Rasband, W.S., and Eliceiri, K.W. (2012). NIH Image to ImageJ: 25 years of image analysis. Nat. Methods 9, 671-675.

Schofield, P., Hoffman, B.M., and Rich, A. (1970). Spin-labeling studies of aminoacyl transfer ribonucleic acid. Biochemistry 9, 2525-2533.

Schuster, C.F., and Bertram, R. (2014). Fluorescence based primer extension technique to determine transcriptional starting points and cleavage sites of RNases in vivo. J. Vis. Exp. (92), e52134.

Seshagiri, S., Stawiski, E.W., Durinck, S., Modrusan, Z., Storm, E.E., Conboy, C.B., Chaudhuri, S., Guan, Y., Janakiraman, V., Jaiswal, B.S., et al. (2012). Recurrent R-spondin fusions in colon cancer. Nature 488, 660-664.

Shi, Z., and Barna, M. (2015). Translating the genome in time and space: specialized ribosomes, RNA regulons, and RNA-binding proteins. Annu. Rev. Cell Dev. Biol. 31. 31-54.

Shi, Z., Fujii, K., Kovary, K.M., Genuth, N.R., Röst, H.L., Teruel, M.N., and Barna, M. (2017). Heterogeneous Ribosomes Preferentially Translate Distinct Subpools of mRNAs Genome-wide. Mol. Cell 67, 71-83.e7.

Slavov, N., Semrau, S., Airoldi, E., Budnik, B., and van Oudenaarden, A. (2015). Differential Stoichiometry among Core Ribosomal Proteins. Cell Rep. 13, 865-873

Sloan, K.E., Warda, A.S., Sharma, S., Entian, K.-D., Lafontaine, D.L.J., and Bohnsack, M.T. (2017). Tuning the ribosome: the influence of rRNA modification on eukaryotic ribosome biogenesis and function. RNA Biol. 14, 1138-

Subramanian, A., Tamayo, P., Mootha, V.K., Mukherjee, S., Ebert, B.L., Gillette, M.A., Paulovich, A., Pomeroy, S.L., Golub, T.R., Lander, E.S., and Mesirov, J.P. (2005). Gene set enrichment analysis: a knowledge-based approach for interpreting genome-wide expression profiles. Proc. Natl. Acad. Sci. USA 102. 15545-15550.

Tan, C., and Du, X. (2012). KRAS mutation testing in metastatic colorectal cancer. World J. Gastroenterol. 18, 5171-5180.

Taoka, M., Nobe, Y., Yamaki, Y., Sato, K., Ishikawa, H., Izumikawa, K., Yamauchi, Y., Hirota, K., Nakayama, H., Takahashi, N., and Isobe, T. (2018). Landscape of the complete RNA chemical modifications in the human 80S ribosome. Nucleic Acids Res. 46, 9289-9298.

Taoka, M., Nobe, Y., Yamaki, Y., Yamauchi, Y., Ishikawa, H., Takahashi, N., Nakayama, H., and Isobe, T. (2016). The complete chemical structure of Saccharomyces cerevisiae rRNA: partial pseudouridylation of U2345 in 25S rRNA by snoRNA snR9. Nucleic Acids Res. 44, 8951–8961.

Vasaikar, S., Huang, C., Wang, X., Petyuk, V.A., Savage, S.R., Wen, B., Dou, Y., Zhang, Y., Shi, Z., Arshad, O.A., et al.; Clinical Proteomic Tumor Analysis Consortium (2019). Proteogenomic Analysis of Human Colon Cancer Reveals New Therapeutic Opportunities. Cell 177, 1035–1049.e19.

Vlachos, A., Rosenberg, P.S., Atsidaftos, E., Alter, B.P., and Lipton, J.M. (2012). Incidence of neoplasia in Diamond Blackfan anemia: a report from the Diamond Blackfan Anemia Registry. Blood 119, 3815-3819.

Vogel, C., and Marcotte, E.M. (2012). Insights into the regulation of protein abundance from proteomic and transcriptomic analyses. Nat. Rev. Genet. 13, 227-232.

Cancer Genome Atlas Research Network; Weinstein, J.N., Collisson, E.A., Mills, G.B., Shaw, K.R., Ozenberger, B.A., Ellrott, K., Shmulevich, I., Sander, C., and Stuart, J.M. (2013). The Cancer Genome Atlas Pan-Cancer analysis project. Nat. Genet. 45, 1113-1120.

Wurm, J.P., Meyer, B., Bahr, U., Held, M., Frolow, O., Kötter, P., Engels, J.W., Heckel, A., Karas, M., Entian, K.-D., and Wöhnert, J. (2010). The ribosome assembly factor Nep1 responsible for Bowen-Conradi syndrome is a pseudouridine-N1-specific methyltransferase. Nucleic Acids Res. 38, 2387-2398.

Xu, Y., Vanommeslaeghe, K., Aleksandrov, A., MacKerell, A.D., Jr., and Nilsson, L. (2016). Additive CHARMM force field for naturally occurring modified ribonucleotides. J. Comput. Chem. 37, 896-912.

Xue, S., Tian, S., Fujii, K., Kladwang, W., Das, R., and Barna, M. (2015). RNA regulons in Hox 5' UTRs confer ribosome specificity to gene regulation. Nature 517, 33-38.

Yang, J., Sharma, S., Watzinger, P., Hartmann, J.D., Kötter, P., and Entian, K.-D. (2016), Mapping of Complete Set of Ribose and Base Modifications of Yeast rRNA by RP-HPLC and Mung Bean Nuclease Assay. PLoS One 11, e0168873.



# **STAR**\***METHODS**

# **KEY RESOURCES TABLE**

REAGENT or RESOURCE	SOURCE	IDENTIFIER
Antibodies		
Rat Monoclonal anti-puromycin – AlexaFlour 488 conjugated. Clone 12D10	MilliporeSigma	Cat# MABE343-AF488; RRID:AB_2736875
Chemicals, Peptides, and Recombinant Proteins		
Fetal Bovine Serum	Invitrogen	Cat# F1051
DMEM growth media	STEMCELL Technologies	Cat# 36250
ALT-R S.p. Cas9 Nuclease	IDT	Cat# 1081059
Puromycin	STEMCELL Technologies	Cat# 73342
TRIzol Reagent	Invitrogen	Cat# 15596-018
SuperScript III	Invitrogen	Cat# 18080044; Lot# 2042663
SuperScript IV	Invitrogen	Cat# 18090010; Lot# 00721480
UltraScript 2.0	PCR Biosystems	Cat# PB30.31-10; Lot# PB130614-01-5
WarmStart RTx	NEB	Cat# M0380L; Lot# 0061705
Turbo DNase	Invitrogen	Cat# AM1907
HinFl	NEB	Cat# R0155S
RNase H	Epicenter	Cat# H39500
RNase I	Invitrogen	Cat# AM2294
T4 PNK buffer	NEB	Cat# B0201S
FastAP	ThermoFisher	Cat# EF0651
RNase T1/A mixture	ThermoFisher	Cat# EN0551
NHS-dPEG12-biotin	SigmaAldrich	Cat# QBD10198-50MG
cOmplete protease inhibitor cocktail, EDTA free	SigmaAldrich	Cat# 4693132001
TMT10plex Isobaric label reagent set	ThermoFisher	Cat# 90406
Critical Commercial Assays		
NEBNext poly(A) mRNA isolation module	NEB	Cat# E7490L
Maxima H minus First Strand cDNA synthesis kit	ThermoFisher	Cat# K1652
NEBNext Ultra II directional RNA second strand synthesis	NEB	Cat# E7771
Deposited Data		
HCT116 WT and TSR3[KO] RNA-seq	This study	SRA: PRJNA602544
HCT116 WT and TSR3[KO] Ribo-seq	This study	SRA: PRJNA602544
HCT116 WT and TSR3[KO] TMT-MS/MS	This study	PRIDE: PXD017483
HCT116 assembled transcriptome	This study	https://crownproject.s3-us-west-2.amazonaws.com/pub/hct116-gencode_assembly.gtf
Experimental Models		
Human HCT116 Cell line. Passage 3 upon receipt.	ATCC	CCL-247, RRID:CVCL_0291
HCT116 Cancer Cell Line Encyclopedia DNA-seq and RNA-seq	Ghandi et al., 2019	SRA: PRJNA523380
CRC Patient Cohort I RNA-seq	Seshagiri et al., 2012	EGA: EGAD00001000215
CRC Patient Cohort II RNA-seq	Lim et al., 2015	SRA: PRJNA218851
The Cancer Genome Atlas Cohorts RNA-seq	Cancer Genome Atlas Research Network	dbGAP: phs000178.v11.p8
CPTAC-CRC Patient Cohort. RNA-seq	Vasaikar et al., 2019	dbGAP: phs000892.v6.p1

(Continued on next page)





REAGENT or RESOURCE	SOURCE	IDENTIFIER
Human reference genome, GRCh38/hg38	Genome Reference Consortium	http://hgdownload.soe.ucsc.edu/goldenPath/hg38/bigZips/analysisSet/hg38.analysisSet.2bit
Human rDNA reference sequence, hgr1	Babaian, 2017	https://crownproject.s3-us-west-2.amazonaws.com/pub/hgr1.zip
Gencode simple gene annotation v 31	Frankish et al., 2019	ftp://ftp.ebi.ac.uk/pub/databases/gencode/ Gencode_human/release_31/gencode.v31.basic. annotation.gtf.gz
Human reference proteome.	UniProt	https://www.uniprot.org/proteomes/UP000005640
CRAPome 1.1 Contaminant repository for mass spectrometry	Mellacheruvu et al., 2013	https://www.crapome.org/
Oligonucleotides		
See Table S2 DNA/RNA Oligonucleotides		
Software and Algorithms		
samtools v1.8	Li et al., 2009	http://www.htslib.org/doc/samtools.html
powtie2 v2.3.5.1	Langmead and Salzberg, 2012	http://bowtie-bio.sourceforge.net/bowtie2/index.shtml
ocftools v1.9	Danecek et al., 2011	http://www.htslib.org/doc/bcftools.html
ophat v2.0.14	Kim et al., 2013	https://ccb.jhu.edu/software/tophat/manual.shtml
stringtie v2.0	Pertea et al., 2015	https://ccb.jhu.edu/software/stringtie/
mageJ v1.52h	Schneider et al., 2012	https://imagej.nih.gov/ij/
STAR v2.5.2b	Dobin et al., 2013	https://github.com/alexdobin/STAR
RiboWaltz v1.1.0	Lauria et al., 2018	https://github.com/LabTranslationalArchitectomics/riboWaltz
DEseq2	Love et al., 2014	https://bioconductor.org/packages/release/bioc/ html/DESeq2.html
R v3.5.1	R Development Core Team, 2018	https://www.r-project.org/
VMD v1.9.3	Humphrey et al., 1996	https://www.ks.uiuc.edu/Research/vmd/
NAMD v2.1.2	Phillips et al., 2005	https://www.ks.uiuc.edu/Research/namd/
CHARMM 36	Best et al., 2012	https://www.charmm.org/
Proteome Discoverer v2.4	ThermoFisher	https://www.thermofisher.com/us/en/home/industrial/ mass-spectrometry/liquid-chromatography-mass- spectrometry-lc-ms/lc-ms-software/multi-omics- data-analysis/proteome-discoverer-software.html
Other		
Electronic laboratory notebook for study	This study	https://github.com/ababaian/Crown

# **RESOURCE AVAILABILITY**

# **Lead Contact**

Further information and requests for resources and reagents should be directed to and will be fulfilled by the Lead Contact, Artem Babaian (ababaian@bccrc.ca)

# **Materials Availability**

The HCT116 WT[1-3] and TSR3[KO/Het] cell lines are available upon request, without restriction.

## **Data and Code Availability**

The accession number for the sequencing data (polyA RNA-seq, total RNA-seq and Ribo-seq) reported in this paper is is available on NCBI Short Read Archive SRA:PRJNA602544. The accession number for the proteomics data reported in this study is available at PRIDE:PXD017483. Electronic laboratory notebook for these experiments and analysis scripts are available at https://github.com/ ababaian/Crown.





## **EXPERIMENTAL MODEL AND SUBJECT DETAILS**

#### Sequencing and proteomics data-sets

A detailed list of sequencing accessions and patient or sample IDs is in Table S1A. Briefly, datasets are Colorectal Carcinoma (CRC) RNA-seq cohort I (EGA:EGAD00001000215, Seshagiri et al., 2012), CRC cohort II (SRA:PRJNA218851, Lim et al., 2015), CRC cohort III and IV (TCGA-COAD and TCGA-READ respectively, dbGAP:phs000178.v11.p8, Cancer Genome Atlas Research Network et al., 2013), and the CRC-CPTAC cohort (dbGAP:phs000892.v6.p1, Vasaikar et al., 2019). All other (TCGA) cancer RNA-seq cohorts (dbGAP:phs000178.v11.p8, Cancer Genome Atlas Research Network et al., 2013). CRC whole exome data were from cohort III (TCGA-COAD, dbGAP:phs000178.v11.p8, Cancer Genome Atlas Research Network et al., 2013), and HCT116 RNA-seq and whole genome sequencing was from the CCLE project (SRA:SRR8615282 and SRA:SRR8639145 respectively, Ghandi et al., 2019). This studies' HCT116 TSR3[KO/Het] polyA RNA-seq, total RNA-seq and Ribo-seq are available on SRA:PRJNA602544 and proteomics on PRIDE:PXD017483.

#### **HCT116** cell culture

The male colorectal carcinoma cell line HCT116 (CCL-247, ATCC, Manassas, VA) was cultured in complete media [DMEM media (#36250, STEMCELL Technologies, Vancouver, Canada) supplemented with 10% fetal bovine serum (F1051, Invitrogen, Waltham, MA)].

Cell lines and clonal isolates were tested to be free of mycoplasma contamination by DAPI staining and microscopy and with LookOut Mycoplasma Detection Kit (MP0035, MilliporeSigma, Burlington, MA) by manufacturer's protocol.

#### **METHOD DETAILS**

## Ribosomal sequence alignment and variant allele frequency calculations

RNA-seq libraries used in this study were prepared via poly-A selection to enrich for the ~5% of mRNA from total RNA. Since rRNA is ~80% of cellular RNA it invariably 'contaminates' RNA-seg libraries. Typically, poly-(A) RNA-seg libraries contain 3.55% (+/- 0.685, 95% CI, CRC I cohort, n = 66) of total reads aligned to rDNA. Whole genome DNA-seq (WGS) libraries were processed from initial fastq files. The 876 TCGA-COAD whole exome DNA-seq (WXS) aligned libraries were downloaded and reads mapping to the contig "chrUn\_GL000220v1" (which contains a complete RNA45S gene) were extracted with 'samtools' (Li et al., 2009) into fastq files. 415/ 438 cancer samples and 413/438 normal samples had rDNA coverage at a total of 15,175x and 17,936x, respectively. A complete list of library accessions used in this study is available in Table S1A (Cancer Genome Atlas Research Network et al., 2013; Ghandi et al., 2019: Lim et al., 2015: Seshagiri et al., 2012).

Libraries were aligned to the hgr1 reference rDNA sequence (Babaian, 2017) with bowtie2 (v. 2.3.5.1, command: 'bowtie2-verysensitive-local -x hgr1 - 1 < read1.fq.gz > -2 < read2.fq.gz > 1 (Langmead and Salzberg, 2012). For each cohort of libraries, a genomic variant call format (GVCF) was created with bcftools (v. 1.9, command: 'bcftools mpileup -f hgr1.fa -max-depth 10000 -A -min-BQ 30 -b < bam.file.list > 1) (Danecek et al., 2011).

GVCF files were processed in R by custom scripts to calculate variant allele frequency (VAF), VAF is defined as 1 - reference allele frequency (reference allele depth of coverage / total depth of coverage) (scripts available at https://github.com/ababaian/crown)

The threshold to define hypo-modification of an RNA base (including 18S.1248.m¹acp³Ψ) was defined as three standard deviations below average VAF of the normal samples within the same cohort (false discovery rate = 0.00135) when available. Fixed formalin paraffin embedded (FFPE) libraries in TCGA were negative for 18S.1248.m<sup>1</sup>acp<sup>3</sup>Ψ, 28S.1321.m<sup>1</sup>A and 28S.4532.m<sup>3</sup>U modification signatures and excluded from further analysis. In the CPTAC-CRC cohort (normal RNA-seq is unavailable), hypo-m<sup>1</sup>acp<sup>3</sup>Ψ and normo-m<sup>1</sup>acp<sup>3</sup> $\Psi$  was defined by the lower (< 25%) and upper (> 75%) quantiles of samples within a batch.

## **Generating HCT116 TSR3 knockouts**

To generate TSR3 knockouts, 105 HCT116 cells were transfected with 10 nmol of one of three TSR3 targeting Alt-R CRISPR-Cas9 ribonucleoproteins or non-targeting controls (Table S1B) by manufacturer's protocol (1081059, Integrated DNA Technologies (IDT), Coralville, IA). After 24 h, single cells from each treatment group were isolated by limiting dilution and confirmed to be 1 cell per well by microscopy. Single cell clones were expanded to 5x10<sup>5</sup> cells at which point half the culture was frozen (culture media + 10% DMSO) and half were processed for RNA. Putative knockouts were screened by aRT-PCR assay for loss of acp<sup>3</sup>, wild-type controls were randomly selected from non-targeting controls. TSR3 knockouts were genotyped by RNA-seq and functional knockout was confirmed by three independent  $m^1acp^3\Psi$  assays (Figures 3 and S2).

# **RNA** isolation

Cells for RNA extraction were lysed directly in TRIzol reagent (15596-018, Invitrogen), spun 5 min at 12,000 x g to pellet fat and nuclear DNA and then frozen at -80°C. RNA extraction was carried out by manufacturer's protocol. RNA quality was assessed via 2% denaturing RNA agarose gel electrophoresis (heat treated, 95°C for 5 min in 1.5x formamide loading buffer (Masek et al., 2005)) and concentration/purity assessed by spectrophotometer (NanoDrop 2000, ThermoFisher, Waltham, MA). RNA quality for RNA-seg library preparation had a >9.9 RIN score measured by Bioanalyzer 2100 (Agilent, Santa Clara, CA).





# Primer extension for 18S.1248.m¹acp³Ψ modification

Primer extension was performed with 1  $\mu$ g of total RNA, incubated with 2 pmol of  $PE\_1248\_BLOCK$  (IDT) primer and 2U of RNase H (18021-014, Invitrogen) or mock enzyme treatment at 37°C for 20 min followed by heat inactivation at 65°C for 10 min. SuperScript III reverse transcriptase (18080044, lot #2042663, Invitrogen) and the fluorophore labeled  $PE\_1248\_FAM$  primer were added for primer annealing and RT (1h at 50°C) as described previously (Schuster and Bertram, 2014). Labeled cDNAs were re-suspended in 1.5x formamide loading buffer and heated to 95°C for 3 min to eliminate secondary structures (Masek et al., 2005). Samples were separated on a 2% agarose gel at 114 V for 3h at 4°C or on a 12.5% polyacrylamide gel at 45 mA for 2.5h in 1x TBE. After migration, the gel was visualized with the Typhoon FLA 9500 laser scanner (FAM filter, 50  $\mu$ m pixel and 450 V unless otherwise noted, GE Healthcare, Chicago, IL).

## Aminocarboxyl propyl Reverse Transcription (aRT)-PCR for 18S.1248.m<sup>1</sup>acp<sup>3</sup>Ψ modification

The aminocarboxylpropyl reverse transcription (aRT)-PCR assay for 1248.m¹acp³Ψ modification was performed with 1 ug of DNase treated (AM1907, lot #00733051, Invitrogen) RNA after total RNA quality was assessed by denaturing agarose gel electrophoresis (Masek et al., 2005). RT reaction was carried out with 220 ng RNA with SuperScript III (18080044, lot # 2042663, Invitrogen), SuperScript IV (18090010, lot #00721480, Invitrogen), UltraScript 2.0 (PB30.31-10, lot #PB130614-01-5, PCR Biosystems, Wayne PA) and WarmStart RTx (M0380L, lot #0061705, NEB) by each manufacturer's protocol with minor modifications. aRT reactions were carried out with a random hexamer primer only (for rRNA), and not poly(T) oligos. cDNAs were diluted five-fold and 1 uL was used as template for PCR [25 cycles: 94°C for 30 s, 55°C for 30 s, 72°C for 30 s; 2mM MgCl<sub>2</sub>; 0.4 mM dNTP; 3.2% DMSO; with 0.2 mM *macp\_F1* and *macp\_R1* primers (Table S1B)]. 5/30 uL amplicons were digested with HinFI (R0155S, NEB (25°C for 5 s, 37°C for 90 min, 80°C for 20 min). Samples were separated on a 2.25% agarose gel in 1x TBE at 200 V for 45 min at 4°C. After migration, the gel was post-stained in 1x GelRed (41003, Biotium, Fremont CA) for 30 min. Gels were visualized by UV transillumination, captured in gray scale with a digital camera and pseudo-colored in ImageJ (Schneider et al., 2012) (v 1.52h, Lookup table > Fire) which retains the original pixel intensity values but highlights band-intensity visualization. Extended protocol is available in the laboratory notebook, https://github.com/ababaian/Crown.

## SCARLET for 18S.1248.m¹acp³Ψ modification

The validation of 18S.1248.m1acp $3\Psi$  was performed by site-specific cleavage and radioactive-labeling followed by ligation-assisted extraction and thin-layer chromatography (SCARLET) as previously described (Liu et al., 2013) with minor modifications.

Briefly, 1  $\mu$ g of total RNA from HCT116 WT or *TSR3*[KO] was annealed with 3 pmol of chimera oligo (oligo sequences in Table S1B) in 2.5  $\mu$ L 30 mM Tris-HCl pH 7.5, by heating at 95°C for 1 min. The sample was incubated at 44°C for 1 h in total volume of 5  $\mu$ L 0.4 × T4 PNK buffer (B0201S, NEB) supplemented with 1 U/ $\mu$ l RNase H (H39500, Epicenter, Madison, WI) and 1 U/ $\mu$ l FastAP (EF0651, Thermo Fisher Scientific), followed by incubation at 75°C for 5 min. 1  $\mu$ L of radioactive labeling buffer (1 × T4 PNK buffer, 2.5 U/ $\mu$ l T4 PNK, 4  $\mu$ Ci/ $\mu$ l [ $\gamma$ -32P]ATP) was added to the RNA and incubated at 37°C for 1 h and then at 75°C for 5 min. The mixture was then annealed with 4 pmol splint oligo and 4 pmol 116-mer DNA oligo by heating at 75°C for 3 min followed by addition of 2.9  $\mu$ L ligation buffer (1.4 × PNK buffer, 0.2 mM ATP, 57% DMSO, 5 U/ $\mu$ l T4 DNA ligase) and incubation for 3.5 h at 37°C. The ligation was stopped by adding an equal volume of RNA urea loading buffer (8 M urea, 100 mM EDTA, 0.025% (w/v) bromphenol blue) and then was digested by incubated with 1  $\mu$ L RNase T1/A mixture (EN0551, Thermo Fisher Scientific) at 37°C for 16 h. The sample was loaded on 10% denaturing urea-PAGE to isolate the ligation product, which was desalted by ethanol precipitation. The pellet was resuspended in 9  $\mu$ L sodium acetate/acetic acid buffer pH 4.6, supplemented with 2mM ZnCl2 and 5 units of nuclease P1, reaction was incubated) at 37°C for 4 h and then was spotted on a TLC plate for separation. The result was visualized on a Typhoon FLA 9500 phosphor imager (GE Healthcare).

# Biotinylation of 18S.1248.m¹acp³Ψ modification

We have exploited reactivity of the  $m^1acp^3\Psi$  base with N-hydroxysuccinimide esters which was initially described in early 1970's (Gillam et al., 1968; Schofield et al., 1970; Friedman, 1972). Briefly, 10  $\mu$ g of total RNA from HCT116 WT or TSR3[KO] in 47  $\mu$ l of reaction buffer (100 mM phosphate buffer pH 8.0, 150 mM NaCl, 0.5 M EDTA pH 8.0) were denatured for 5 min at 70°C and placed on ice. After that 1 $\mu$ l of 100 mM NHS-dPEG12-biotin (QBD10198-50MG, Sigma Aldrich) in DMSO was added. Reaction was incubated on ice for 2 h, every 40 min 1  $\mu$ l of 100 mM of NHS-dPEG12-biotin was added (3 times in total). After treatment RNA was purified with Zymo-Spin IIC column, resolved on denaturing agarose gel and blotted on Hyperbond N+ (Amersham) membrane. RNA was UV crosslinked twice with 1200  $\mu$ J followed by incubation in blocking solution (phosphate buffered saline [PBS], pH 7.5, 10% SDS, 1 mM EDTA) for 20 min. The membrane was probed with 1:10000 dilution of 1 mg/ml streptavidin-horseradish peroxidase (Pierce) in blocking solution for 15 min, washed six times in PBS containing decreasing concentrations of SDS (10%, 1%, and 0.1% SDS, applied twice each) for 5 min and finally the biotin signal was visualized by ECL detection reagent (10 min exposure time).

# **RNA-seq**

RNA-seq library preparation and sequencing was performed by the BC Cancer Genome Sciences Centre, Vancouver, Canada. Briefly, 75-bp stranded and paired-end poly-(A) RNA-seq libraries were prepared with NEBNext poly(A) mRNA magnetic isolation module (E7490L, New England BioLabs (NEB), Ipswich, MA), Maxima H minus First Strand cDNA synthesis kit (K1652, Thermo-



Fisher), and NEBNext Ultra II directional RNA second strand synthesis (E7771, NEB). The total RNA-seq libraries were prepared in parallel but without poly-(A) selection and only 2x PCR cycles (for adaptor ligation). Libraries were sequenced on a HiSeq 2500 (Illumina, San Diego, CA).

#### Ribo-seq

Ribosome foot printing (ribo-seq) was performed as previously described (Ingolia et al., 2012) with minor modifications. For cell harvesting, the culture medium was aspirated, cells were washed twice with ice-cold PBS supplied with 100  $\mu$ g/ml cycloheximide and plates were flash-frozen in liquid nitrogen. For cell lysis, the plates were placed on wet ice and 400  $\mu$ l of mammalian polysome buffer (MPB) [20 mM Tris-HCl, pH 7.4, 150 mM NaCl, 5 mM MgCl<sub>2</sub>, with 1 mM DTT and 100  $\mu$ g/ml cycloheximide, 1% (vol/vol) Triton X-100, 25 U/ml Turbo DNase (AM2238, Invitrogen) was dripped onto the plates. Cells were scraped, the lysate was collected to fresh 1.5 mL tube, passed ten times through a 26-gauge needle, cleared by centrifugation at 20,000 x g for 10 min, flash-frozen in liquid nitrogen and stored at  $-80^{\circ}$ C until further use. For isolation of ribosome-protected RNA fragments, 240  $\mu$ L of the lysate was digested with 6  $\mu$ L of RNase I (AM2294, 100 U/ $\mu$ l, Invitrogen) at room temperature with rotation. After 45 min 8  $\mu$ L of SUPERase-In (20 U/ $\mu$ l, AM2694, Invitrogen) was added to reaction and passed through MicroSpin S-400 HR columns (27-5140-01, GE Healthcare) equilibrated with mammalian polysome buffer. RNA was extracted from the flow-through using Trizol LS (10296-010, Invitrogen) followed by depletion of ribosomal RNA fragments with the RiboZero Kit (MRZH11124, Illumina). Ribosome-protected RNA fragments were loaded onto denaturing 17% urea-PAGE gel (EC-829, National Diagnostics) and gel area ranging from 27 nt to 30 nt, defined by corresponding RNA markers, was cut out. Purified RNA fragments were subjected to library generation using 3′ adaptor 4N-RA3, 5′ adaptor OR5-4N, RT primer RTP and PCR primers RP1 (forward primer) and RPI1-15 (reverse primers, containing barcodes). Libraries were sequenced on a HiSeq 4000 device (Illumina).

## Cell cycle and puromycin incorporation assays

HCT116 cells were seeded at  $2 \times 10^5$  cells per 6-well plate and allowed to grow until log-phase of growth at  $\sim 50\%$ –75% confluency. To detach cells, cells were washed twice with PBS, detached with 0.5 mL 0.25% trypsin EDTA (07901, STEMCELL) for 5 min at RT, followed by inactivation with 2.5 mL of complete media and cells pelleted at 300 x q for 5 min at 4°C. Pellets were washed twice with cold PBS.

For cell cycle analysis, cells were fixed overnight at 4°C in 70% EtOH solution. Fixed cells were washed in PBS and resuspended in 500 ul of staining solution [Propidium Iodide (50 ug/ml), RNase A (0.1 mg/ml), and 0.05% Triton X-100 in PBS], and incubated 30 min at RT in the dark followed by a wash step. Flow cytometry was performed on a FACScalibur with *CellQuest* acquisition software (BD Biosciences) acquiring at least 10,000 cells per sample and analyzed with *FlowJo* (v 10.0.8). Cell cycle gating was performed on single-cells using the automated 'Watson Model'.

Puromycin-incorporation assay was performed as previously described (Schmidt et al., 2009). Briefly, cells were pulsed with either complete media only or complete media containing 10 ug/mL Puromycin (73342, STEMCELL) for 10 min in cell incubator. Cells were washed twice in pre-warmed PBS and chased for 50 min in incubator. Cells were then detached, washed, and fixed in 2% paraformaldehyde in PBS for 15 min at RT. Cells were then washed twice in wash solution (5% FBS, and 0.1% Saponin in PBS). 1x10<sup>5</sup> cells were stained in 100 ul of 1:100 anti-puromycin antibody (12D10) conjugated to Alexa Flour 488 (MAEBE343-AF488, MilliporeSigma) in wash solution for 30 min on ice followed by two final washes in wash solution and resuspension in 100 ul PBS for flow cytometry to acquire at least 5,000 cells per sample. Unstained controls were performed on puromycin treated cells.

# **Polysome Fractionation**

Polysome fractionation was performed as previously described (Floor and Doudna, 2016), with minor modifications. Media was removed from 100 mm dish with  $\sim\!10^7$  cells and washed with ice-cold ddH $_2$ O containing 100  $\mu$ M CHX. All subsequent steps were performed chilled at  $4^\circ\text{C}$  or on ice. After ddH $_2$ O aspiration, cells were incubated for 30 min in 450  $\mu$ L of hypotonic lysis buffer [0.1x polysome base buffer (PBB), 150 mM KCl, 20 mM Tris-HCl pH 7.4, 15 mM MgCl $_2$  in ddH $_2$ O; with 1% Triton X-100 and 1x protease inhibitor (4693132001, MilliporeSigma). After confirming >95% free nuclei with a hemocytometer, nuclei were pelleted by centrifugation at 1,800 x g for 5 min. Cytoplasmic fraction was separated from mitochondria by centrifugation at 10,000 x g for 5 min. 300  $\mu$ L cytoplasmic lysate was layered atop at 7%–45% sucrose gradient (Gradient Master, BioComp, Fredericton, Canada) in 1x PBB. Gradients were ultra-centrifuged at 221,600 x g for 2 h at 4°C (SW-41Ti rotor, 331362, Beckman Coulter, Brea, CA). Gradients were fractionated (Piston Fractionator, BioComp) into 20 x 300  $\mu$ L fractions with in-line UV-scanning at 254 nm. Fractions were immediately frozen at  $-20^\circ\text{C}$  for subsequent RNA extraction.

# Ribosomal molecular dynamics simulations

All molecular dynamics (MD) simulations were performed as previously described (Girodat et al., 2019). In brief, 80S ribosome models were derived from available human Cryo-EM structures with a resolved 18S.1248.m $^{1}$ acp $^{3}\Psi$  (PDB: 6EKO for E-site tRNA and 6OLE for A/P and P/E tRNA) (Li et al., 2019; Natchiar et al., 2017).

For simulations lacking complete m<sup>1</sup>acp<sup>3</sup>  $\Psi$  modifications, the base was converted to each respective precursor. Each system was protonated with the *psfgen* package in VMD 1.9.3, and only e-nitrogen for histidine were protonated (Humphrey et al., 1996). Each system was solvated with a 10Å TIP3P water box with a concentration of 7mM MgCl2 and 100mM KCl using the *solvate* and *auto-ionize* packages, respectively (Humphrey et al., 1996). All minimizations and MD simulations were performed with *NAMD* 2.1.2 using





CHARMM 36 standard parameters (Best et al., 2012; Denning et al., 2011; Phillips et al., 2005) and modified nucleic acid parameters from (Xu et al., 2016).

Each system underwent a steepest descent minimization of water for 10,000 steps then water and ions for 100,000 steps twice followed by minimization of nucleic acid and protein for 50,000 steps and finally the whole system for 100,000 steps. After minimization all systems were equilibrated to 300 and 350 K for 150 ps. Coordinates of the 350 K equilibration in conjunction with velocities from the 300 K equilibration were used as initial parameters for the MD simulation. Each system was simulated for ~20ns. RMSD, RMSF, dihedral angel, and distance measurements were performed with VMD 1.9.3 (Humphrey et al., 1996).

#### Tandem Mass Tag labeling and liquid-chromatography and tandem mass spectrometry (TMT LC-MS/MS)

HCT116 [WT] and TSR3[KO/Het] cells were grown to 80% confluence in a 100mm dish, washed in PBS, detached, and washed twice in PBS. Cell suspensions were aliquot into technical triplicates and pelleted before snap freezing. One of each HCT116 [WT] and duplicates of HCT116 TSR3[KO/Het] clones were processed for LC-MS/MS. Pellets were lysed in 200 µL lysis buffer [4M Guanidine HCl (G4505-500G, Sigma), 40 mM 2-chloroacetamide (22790, Sigma), 10mM tris(2-carboxyethyl) phosphine (C4706-2G, Sigma), 5 mM Ethylenediaminetetraacetic acid (AM9260G, Invitrogen), 1x phosSTOP inhibitor (4906845001, Sigma), 1x cOmplete protease inhibitor cocktail, EDTA free (4693132001, Sigma), 50 mM HEPES (H3784-100G, Sigma)].

The cells were lysed by bead beating using Lysing D matrix tubes (116913100, Cedarlane Laboratories) in a FastPrep 24 instrument (116005500, MP Biomedical) at 8 M/s for 30 s, resting 90 s, and a second round of bead beating at 8 M/s for 30 s. Supernatant was transferred into 1.5 mL lo-bind tubes (022363204, Eppendorf) Protein were solubilized and denatured by heating at 95°C for 15 min with shaking at 1000 rpm in a thermomixer (05-400-205, Fisher Scientific).

All experiments used a 1:1 combination of two different types of carboxylate-functionalized beads, both with a hydrophilic surface (45152105050350 and 65152105050350, Sera-Mag Speed beads, GE Life Sciences). The magnetic particles are an average diameter of 1 μm. The beads were stored at 4°C at a concentration of 10 μg/μL, and processed with magnetic racks (PR-Z5481, FisherScientific)

The Sera-Mag SP3 1:1 bead mix was rinsed once with 200 uL HPLC water (270733, Sigma,) and diluted to a final working concentration of 20 µg/µL. To each sample, 200 µg of bead mixture was added and mixed by pipetting to generate a homogeneous solution. To induce protein binding to the beads, ethanol (34852, Sigma) was added to achieve a final concentration of 50% (v/v). Bead-protein solutions were mixed to ensure a homogeneous distribution of the beads and incubated for 5 min at 24°C with 1000 rpm shaking in a thermomixer. After incubation, tubes were placed on a magnetic rack for 2 min then the supernatant was removed and discarded. The beads were rinsed three times with 200 µL of freshly prepared 80% ethanol in water, and the supernatant was discarded each time. Rinsed beads were reconstituted in aqueous buffer (100 µL, 50 mM HEPES pH 8.0) containing a 1:50 (µg:µg) enzyme to protein amount of trypsin/LysC mix (V5071, Promega). Mixtures were incubated for 16 h at 37°C with 1000 rpm shaking in a thermomixer. The supernatants were recovered using a magnetic rack and transferred to fresh 1.5mL lo-bind Eppendorf tubes.

Tandem Mass Tag (TMT) labels (5 mg per vial, 90406, Pierce) were reconstituted in 500 μLof HPLC acetonitrile (34851-4L, Sigma) and frozen at  $-80^{\circ}$  C. Prior to labeling, TMT labels were removed from the freezer and allowed to equilibrate at room temperature. A standard 13 cell line "supermix" digest mix was prepared as described above and included as an internal standard. Labeling was performed by addition of TMT label in two volumetrically equal steps of to achieve a 2:1 (μg:μg) TMT label to peptide final concentration with 30 min incubation at room temperature for each labeling step. Reactions were quenched by addition of an equal volume of 1 M glycine (G8898, Sigma) in water. Labeled peptides were concentrated in a SpeedVac centrifuge (781001010234 + RVT400-115, Labconco) to remove acetonitrile, combined, acidified to a concentration of 1% trifluoroacetic acid (T6508-100mL, Sigma,) and peptides were purified using a C18 SepPak (WAT054960, Waters). The SepPak was conditioned with 2 mL 0.1% trifluoroacetic acid in HPLC grade acetonitrile and equilibrated with 2 mL of 0.1% trifluoroacetic acid in HPLC water. The sample was loaded on the SepPak and rinsed with 3 mL of 0.1% formic acid (, 56302-50ML-F, Sigma) in HPLC water. Peptides were eluted using two 600 uL aliquots of 80% acetonitrile in HPLC water with 0.1% formic acid.

High-pH reversed phase analysis was performed on an Agilent 1100 HPLC system (G1364C, G1315A, G1311A). Fractionation was performed on a Kinetix XB C18 column (2.1 × 150 mm, 1.7 μm core shell, 100 Å, Phenomenex, 00F-4498-AN). Elution was performed with a gradient of mobile phase A (water and 0.1% formic acid) to 7% B (acetonitrile and 0.1% formic acid) over 2 min, to 25% B over 94 min, to 40% over 17 min, with final elution (80% B) and equilibration (5% B) using a further 7 min all at a flow rate of 450 nL/min. Fractions were collected every min across the elution window for a total of 48 fractions, which were concatenated to a final set of 12 (e.g., 1 + 13 + 25 + 37 = fraction 1). Fractions were dried in a SpeedVac centrifuge and reconstituted in 0.1% formic prior to MS analysis.

Analysis of TMT labeled peptide fractions was carried out on an Orbitrap Fusion Tribrid MS (IQLAAEGAAPFADBMBCX, Thermo Scientific). Samples were introduced using an Easy-nLC 1000 system (LC120, Thermo Scientific). Trapping columns were packed in 100 μm internal diameter, 360 um outer diameter fused silica capillary (1068150023, Molex) to a length of 25 mm with C18 beads (Reprosil-Pur, Dr. Maisch GmbH, 3 μm particle size, r13.b9.0001). The analytical column was packed with C18 (Reprosil-Pur, Dr. Maisch, 3 μm particle size) to a length of 15 cm in a 100 μm 100 μm internal diameter, 360 um outer diameter fused silica capillary with a laser-pulled electrospray tip. Trapping was carried out for a total volume of 10 μL at a pressure of 400 bar. After trapping, gradient elution of peptides was performed on and heated to 50 °C using AgileSLEEVE column ovens (AS1032 + AS1532H, Analytical Sales & Service). Elution was performed with a gradient of mobile phase A (water and 0.1% formic acid) to 8% B (acetonitrile and

# Report



0.1% formic acid) over 5 min, to 25% B over 88 min, to 40% over 20 min, with final elution (80% B) and equilibration (5% B) using a further 7 min at a flow rate of 375 nL/min.

Data acquisition on the Orbitrap Fusion (control software version 3.1.2412.17) was carried out using a data-dependent method in positive ion mode. Survey scans covering the mass range of 400 - 1200 were acquired in profile mode at a resolution of 120,000 (at m/z 200), with quadrupole isolation enabled, an S-Lens RF Level of 60%, a maximum fill time of 120 ms, an automatic gain control (AGC) target value of 4e5, and one microscan. For MS2 scan triggering, monoisotopic precursor selection was enabled for peptides, charge state filtering was limited to 2-4, undetermined charge states were included, and dynamic exclusion of masses selected one time was enabled for 15 s with a tolerance of 20 ppm. HCD fragmentation with a maximum fill time of 20 ms, quadrupole isolation, an isolation window of 1.4 m/z, isolation offset off, a fixed collision energy of 40%, injection for all available parallelizable time turned OFF, and an AGC target value of 1.2e5 was performed. The Orbitrap was used as the detector in normal scan range mode with a resolution of 50,000 at 200 m/z and the first mass was 120 m/z. Centroided data were collected with one microscan. The total allowable cycle time was set to 3 s.

#### **QUANTIFICATION AND STATISTICAL ANALYSIS**

#### Transcriptome and translatome alignment, assembly, and differential expression

RNA-seq reads were aligned to hg38 (GRCh38) reference genome with tophat2 (v.2.0.14) (Kim et al., 2013). Individual transcriptome assemblies for HCT116 [WT 1-3], [KO 1,2] and [Het 2] libraries were generated with stringtie (v 2.0) (Pertea et al., 2015), and then all merged together with the human gencode basic gene annotation (v. 31) (Frankish et al., 2019) ultimately yielding the hct116\_gencode.v31 reference gene set.

To generate a single-copy reference transcriptome for ribo-seq analysis of HCT116, isoform-specific quantification of gene expression was performed on the hct116\_gencode.v31 gene set with 'stringtie -G hct116\_gencode.gtf'. For each gene with non-zero expression (> 10 unique reads), the one highest expression isoform (average expression from each clone) was chosen as the reference transcript for that gene.

For ribo-seq alignment, after read adaptor trimming and alignment to *hgr1* as above, unmapped reads were aligned against a containment file containing human tRNA, mtDNA, snoRNA, snRNA and miRNA sequences. Reads remaining unmapped were then aligned to *hg38* and the *hct116\_transcriptome* with *STAR* aligner (v. 2.5.2b, command: '*STAR*–*genomeDir hg38*–*readFilesIn* < *input.fq* > –*sjdbFileChrStartEnd hg38/sjdbList.out.tab*–*outFilterMultimapNmax 10*–*outFilterMismatchNmax 5*–*outFilterMatchNmin 15*–*alignSJoverhangMin 5*–*seedSearchStartLmax 20*–*outSJfilterOverhangMin 30 8 8 8*–*quantMode TranscriptomeSAM*') (Dobin et al., 2013). Transcriptome aligned Ribo-seq data were analyzed in *R* (v. 3.5.1) using the *riboWaltz* package (v. 1.1.0)(Lauria et al., 2018).

Gene-level expression and total translation was quantified with the *DEseq2* (Love et al., 2014) R package using *hg38* aligned bam files and the *hct116\_gencode.v31* reference gene set. Ribo-seq Gene expression (RPKM) was calculated based only on reads mapping in-frame to a gene CDS, measure translating ribosomes. Translational efficiency was calculated per genotype as log2(Ribo-seq Gene<sub>RPKM</sub> / RNA-seq Gene<sub>RPKM</sub>).

Gene expression and translation differences were calculated by Gene Set Enrichment Analysis (GSEA, v.4.0.0) (Subramanian et al., 2005) with '-permute gene\_set -nperm 5000' and standard parameters. Transcriptomic GSEA was performed using the MSigDB (Liberzon et al., 2015) (v 7.0): hallmark, C2 pathways, C3 motif search, and C6 oncogenic signatures gene sets. Translatomic and proteomic GSEA was performed with C5 Gene Ontology (GO) gene set.

All bioinformatic analyses were scripted for reproducibility and are available at https://github.com/ababaian/crown, RNA-seq and Ribo-seq data can be directly viewed in the UCSC genome browser at https://genome.ucsc.edu/cgi-bin/hgTracks?hgS\_doOtherUser=submit&hgS\_otherUserName=Artem+Babaian&hgS\_otherUserSessionName=HCT116\_TSR3%2dKO.

# **Puromycin incorporation assay quantification**

Puromycin staining intensity correlated with natural variation in cell size (forward scatter signal, FSC), thus the 488nm staining signal intensity (anti-puromycin) was normalized by cell size (normalized fluorescence = 250 \* anti-puromycin / FSC). The geometric mean florescent intensity (gMFI) and standard deviation for each sample is reported.

#### **Polysome fractionation quantification**

For comparative polysome profiles, the total input per gradient was normalized by taking the area under the curve (AUC) from the beginning of the SSU peak to the end of the last resolved polysome peak and normalizing the are to 100 artificial units. To normalize for sedimentary variation between gradients, the distance of the SSU, LSU, monosome, 2-, 3-, 4-some peaks across all gradients were averaged, and a simple linear regression was applied with the 'In' function in R (v 3.5.1) to regress peaks to a mean distance. Raw and processed data and analysis scripts are available in the online electronic notebook.

## LC-MS/MS data analysis

Peptide detection and protein inference was performed using *Proteome Discoverer* (v 2.4). Searches were performed using *Sequest HT* and the human proteome from Uniprot plus the CRAP-ome (Mellacheruvu et al., 2013). Tryptic cleavages with 2-6 missed cleav-





ages and peptide length of 6-144 was used. The precursor mass tolerance was 10 ppm, fragment mass tolerance was 0.05 Da and monoisotopic masses were used. Only b- and y-type ions were included in the search. Oxidation was allowed as a dynamic modification and the protein terminus was allowed to have acetylation, Met-loss, or Met-loss+acetylation as dynamic modifications. TMT reagents (+229.163 Da) were set as static modifications on the peptide terminus and lysine and carbamidomethyl was assigned as a static modification of cystine. Percolator was used for scoring with an FDR of 0.01, concatenated Target/Decoy Selection, and validation based on the q-Value. The maximum Delta Cn was 0.05 and the maximum rank was 0. Unique + Razor peptides were used for quantification. R (v 3.5.1) was used for data analysis. Peptides were filtered for uniqueness and values were median normalized, and proteins containing at least two unique peptides were included in downstream differential protein expression analysis. The technically replicated samples were merged (mean) and statistical protein expression analysis was performed in R.

#### Statistical tests and reporting

Statistical analysis was performed in R (v 3.5.1). Differences in variant allele frequency (VAF) between tumor and normal patient samples was two-tailed, paired Student's t test with degrees of freedom one less than reported n. Bonferonni multiple-testing correction was applied when screening for changes across 18S and 28S nucleotides. Reported central tendencies are means with error bars as standard deviation and Tukey's boxplot report data quantiles throughout the paper unless otherwise stated in figure legend. Significance (\*) was defined as p < 0.05 or FDR < 0.05 unless otherwise noted.

Differential gene expression and translation was tested with DEseq2 (Love et al., 2014) with Benjamini-Hochberg multiple testing correction at an alpha of 0.05. Multi-group comparisons between HCT116 WT[1],[2],[3] and TSR3[KO 1],[KO 3],[Het2] ribo-seq were performed with one-way ANNOVA, followed by Tukey's Honestly Significant Difference (HSD) test if indicated. Genotypic differences between biological triplicates of WT and TSR3[KO] cells were tested with Student's t test with 2 degrees of freedom and Benjamini-Hochberg multiple testing correction at an alpha of 0.05 where indicated.