TSC2 **loss in neural progenitor cells suppresses**

translation of ASD/NDD-associated transcripts

in an mTORC1- and MNK1/2-reversible fashion

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SUMMARY

Tuberous sclerosis complex (TSC) is an inherited neurodevelopmental disorder (NDD)

with frequent manifestations of epilepsy and autism spectrum disorder (ASD). TSC is caused

by inactivating mutations in *TSC1* or *TSC2* tumor suppressor genes, with encoded proteins

hamartin (TSC1) and tuberin (TSC2) forming a functional complex inhibiting mechanistic

target of rapamycin complex 1 (mTORC1) signaling. This has led to treatment with allosteric

mTORC1 inhibitor rapamycin analogs ("rapalogs") for TSC tumors; however, rapalogs are

ineffective for treating neurodevelopmental manifestations. mTORC1 signaling controls

protein synthesis by regulating formation of the eIF4F complex, with further modulation by

MNK1/2 kinases via phosphorylation of the eIF4F subunit eIF4E. While both these pathways

modulate translation, comparing their impact on transcriptome-wide mRNA translation, as well

as effects of inhibiting these pathways in TSC has not been explored. Here, employing

CRISPR-modified, isogenic TSC2 patient-derived neural progenitor cells (NPCs), we have

examined transcriptome-wide changes in mRNA translation upon *TSC2* loss. Our results

reveal dysregulated translation in *TSC2*-Null NPCs, which significantly overlaps with the

translatome from *TSC1*-Null NPCs. Interestingly, numerous non-monogenic ASD-, NDD- and

epilepsy-associated genes identified in patients harboring putative loss-of-function mutations,

were translationally suppressed in *TSC2*-Null NPCs. Importantly, translation of these ASD-

and NDD-associated genes was reversed upon inhibition of either mTORC1 or MNK1/2

signaling using RMC-6272 or eFT-508, respectively. This study establishes the importance of

mTORC1-eIF4F- and MNK-eIF4E-sensitive mRNA translation in TSC, ASD and other

neurodevelopmental disorders laying the groundwork for evaluating drugs in clinical

development that target these pathways as a treatment strategy for these disorders.

INTRODUCTION

Tuberous sclerosis complex (TSC [MIM: 191100 and MIM: 613254]) is an autosomal

dominant neurodevelopmental disorder (NDD) with clinical involvement of multiple organ

systems including the central nervous system (CNS). TSC is caused by mutations in the *TSC1*

[MIM: 605284] or *TSC2* [MIM: 191092] gene, encoding the tumor suppressor protein hamartin

(TSC1) or tuberin (TSC2), respectively. In addition to slow growing hamartomas in many

organs, neurodevelopmental manifestations such as epilepsy, intellectual disability and autism

spectrum disorders (ASD) are commonly observed in these patients [1-3]. TSC proteins function

as a complex, relaying signals from diverse cellular pathways to control mechanistic target of

rapamycin (mTOR [MIM: 601231]) complex 1 (mTORC1) signaling. Loss of TSC1/TSC2

proteins results in aberrant activation of mTORC1, which has led to first-generation mTORC1

rapalog inhibitors, emerging as a lifelong therapy for TSC hamartomas [4-7]. Moreover, recent

clinical trials reveal that rapalogs reduce epilepsy in 40% of TSC patients [8]. In contrast,

rapalogs are ineffective in treating TSC-associated neuropsychiatric disorders (TAND) and

autism [9; 10].

Among its many activities, mTORC1 signaling plays an essential role in protein synthesis

by regulating the efficiency whereby mRNAs are translated into proteins. Aberrant activation

of mTORC1, as seen with TSC1/TSC2 loss, leads to hyperphosphorylation of key substrates

controlling translation including eukaryotic translation initiation factor (eIF) 4E-binding proteins

(4E-BPs [MIM: 602223 and MIM: 602224]) and p70 ribosomal protein S6 kinase 1 (S6K1 [MIM:

608938]). In the unphosphorylated state, i.e. when mTORC1 activity is low, 4E-BPs bind and

sequester eIF4E [MIM: 133440]. This leads to reduced formation of the heterotrimeric eIF4F-

complex, a key factor for initiation of translation, comprised of eIF4E, eIF4G [MIM: 600495]

and eIF4A [MIM: 602641]. Activation of mTORC1 leads to phosphorylation of 4E-BPs and

thereby release of eIF4E, which promotes eIF4F-complex formation and stimulates 5' cap-

dependent translation (Figure 1A). Phosphorylation of S6K protein affects protein synthesis

and ribosome biogenesis through multiple mechanisms, including release of sequestered

eIF4A via phosphorylation/inactivation of programmed cell death 4 (PDCD4 [MIM: 608610])

(Figure 1A) reviewed in [11; 12]. Importantly, mTORC1 modulates translation, and thereby molds

the proteome, in a transcript-selective fashion depending on features in the 5' untranslated

regions (UTRs) of target mRNAs. Three main classes of transcripts showing translation

paralleling mTORC1 activity have been described: mRNAs with very short 5'UTRs, highly

structured 5'UTRs and those with the 5′ terminal oligopyrimidine (5′ TOP) motif (reviewed in

[13]). Activation of mTORC1 is reported to be associated with suppressed translation of a set of

mRNAs commonly harboring upstream open reading frames in their 5'UTRs [14]. In addition,

phosphorylation of eIF4E at a single conserved serine (S209) by mitogen-activated protein

kinase-interacting kinase MNK1/2 [MIM: 606724 and MIM: 605069] also modulates translation

in a transcript-selective fashion (Figure 1A) [15; 16].

Although commonly used rapalogs efficiently suppress phosphorylation of S6K1, they only

marginally affect 4E-BP1 phosphorylation in many cell types, which is consistent with rapalogs

only partially inhibiting mTORC1 activity [17-19]. This prompted the development of third-

generation bi-steric mTORC1-selective inhibitors, Rapalinks, that link the mTORC1 affinity of

rapamycin with a potent second-generation active-site mTOR kinase inhibitor, resulting in

reduced phosphorylation of both S6K1 and 4E-BP1 [20]. A more recent third-generation bi-steric

mTORC1-selective inhibitor, RMC-6272 (a preclinical tool compound for its clinical counterpart

RMC-5552), shows dramatically improved mTORC1 selectivity as compared to the Rapalink

prototype while potently reducing phosphorylation of both S6K1 and 4E-BP1 (Figure 1A) [21; 22].

Moreover, we recently demonstrated that RMC-6272 is superior to rapamycin in durably

inhibiting the mTORC1-4E-BP1 axis and suppressing tumor growth in patient-derived *NF2*-

deficient models [23]. RMC-6272 has also shown strong anti-tumor activity as a single agent or

when combined with other treatments in several preclinical cancer models [21], and the first-in-

human study of RMC-5552 has offered preliminary data of anti-tumor activity at tolerated

doses (NCT04774952 and Schram et al., 2023 https://doi.org/10.1158/1535-7163.TARG-23-

C020). Additionally, recently developed eFT-508/tomivosertib is a potent and selective

MNK1/2 inhibitor that effectively blocks phosphorylation of eIF4E (Figure 1A) [24] and is in phase

2 clinical trials for several cancer types (NCT02937675, NCT02605083 and NCT03258398).

While numerous global studies of mRNA levels ("transcriptomes") in patient-derived

neuronal models of ASD, TSC and other NDDs have been reported, studies of mRNA

translation are largely lacking. Furthermore, the effects on mRNA translation from highly

specific mTORC1 and MNK inhibitors such as RMC-6272 and eFT-508 in NDDs have never

been explored. Our recent studies employing polysome-profiling to examine mRNA translation

at a transcriptome-wide level in TSC1 patient-derived neural progenitor cells (NPCs)

uncovered *TSC1*-associated transcript-selective alterations in translation that were largely

insensitive to rapamycin. Interestingly, in confirmational studies using NanoString analysis, we

observed that a small subset of selected mRNAs encoding proteins related to synaptic

regulation or ASD were rapamycin-insensitive but showed sensitivity to RMC-6272. Moreover,

unlike rapamycin, RMC-6272 also reversed some of the neurodevelopmental phenotypic

defects in *TSC1*-Null NPCs [25]. These findings suggest a key role of mTORC1-4E-BP1-eIF4E

axis-dependent modulation of mRNA translation in TSC. Here, we have further investigated

the role of this axis in regulating mRNA translation using an isogenic set of CRISPR-modified

TSC2 patient-derived NPCs. Our results reveal a strong overlap in dysregulated translation

observed in *TSC1*-Null and *TSC2*-Null NPCs. Surprisingly, genes previously associated with

ASD and NDD were translationally suppressed in *TSC2*-Null NPCs, and their translation was

reversed upon RMC-6272 or eFT-508 treatment. These results establish the importance of

mTORC1-eIF4F- and MNK-eIF4E-mediated mRNA translation in TSC, ASD and NDDs and

lay the groundwork for evaluating drugs in clinical development that target these pathways as

a treatment strategy for TAND as well as ASD/NDD.

MATERIAL AND METHODS

Human induced pluripotent stem cell derivation

We previously reported collection of post-mortem subungal fibroma (SUF) tissue from a

female sporadic TSC2 patient, which was obtained through the pathology department and

approved by the Institutional Review Board at Massachusetts General Hospital. Detailed

genetic analysis of the patient SUF tissue, including exon-by-exon scanning of the entire coding sequence of *TSC2* isoform 1 (GenBank: NM_000548), identified a single heterozygous (*TSC2*-Het) truncating nonsense mutation in *TSC2* exon 34 (originally reported as coding exon 33; 4207delG, D1400fs>1410X). Further analysis of the SUF tissue for tumor clonality and loss-of-heterozygosity (LOH), using multiple polymorphic chromosome 16 or *TSC2* intragenic markers, revealed a clonal tumor with no second-hit mutations or LOH [26]. For culturing of primary *TSC2*-Het fibroblasts, at the time of collection SUF tissue was rinsed twice in Hank's Balanced Salt Solution (Sigma) followed by mincing in high glucose DMEM (Gibco) containing 15% fetal bovine serum (FBS; Sigma), 0.5 µg/ml fungizone (Life Technologies), 50 g/ml gentamicin (Life Technologies), and 1x penicillin-streptomycin/L-glutamine (Cellgro). The tissue was then digested in the same medium as above (without gentamycin) containing ~5 units collagenase III (Fisher Scientific), for 30 min at 37^0C. Digested tissue was then pelleted by centrifugation, resuspended in high glucose DMEM (containing 15%FBS, 1x penicillin-streptomycin/L-glutamine), and the resulting cultured fibroblast line was then expanded and cryopreserved in liquid nitrogen. Following revival of cryopreserved cells, *TSC2*-Het fibroblasts were reprogrammed using synthetic modified mRNA-based methods to obtain induced pluripotent stem cells (iPSCs) as described [27; 28]. Briefly, cells were transfected by nucleo-electroporation (Amaxa Nucleofector I) with *in vitro* transcribed mRNAs encoding *Oct4, Sox2, Klf4, c-Myc* and *Lin28* (Stemgent). After single clone picking, iPSC colonies were cultured in feeder-free conditions in Essential 8 medium (ThermoFisher) on plates coated with Geltrex (Gibco) using the "thin gel method" according to the manufacturer's instructions. Colonies were passaged every 4-6 days with daily medium change. Sanger sequencing confirmed the original heterozygous mutation in *TSC2*-Het iPSCs (see details below for *TSC2* exon 34 PCR and sequencing).

CRISPR/Cas9-mediated generation of isogenic iPSC lines

To generate both the corrected-wildtype (WT) and Null isogenic iPSC lines, CRISPR/Cas9

genome editing was performed employing parental *TSC2*-Het iPSCs. To achieve gene knock-

in to correct the germline *TSC2* mutation, we followed the same cloning and transfection

strategy as we previously reported for *TSC1* corrected-WT iPSCs [29]. Briefly, using web-based

CRISPR-related tools developed by GenScript (https://www.genscript.com), we designed a

single guide RNA (sgRNA): 5'-GGACATCCTCGGGGACCCTG-3' targeting *TSC2* exon 34

(coding   exon   33)   along   with   an   asymmetric   donor   sequence: 5'-

CCGAGGCCGACCAGGCAGCACTTTCCCCGTCCAGGGTCCCTGACTGTGACCGGGCCT

TAACCTCAGGGCTCAGCCGGCCCACGTCGGCCTTGTCCCCAGGGTCCCCGAGGATGT

CCTGCAGAGTCTGCAG-3' for homology-directed repair. Colonies were manually isolated,

and genomic DNA was extracted from a portion of each colony followed by PCR amplification

using   primers   TSC2-ex33F: 5'-CTGACAGGGGTTCTCTTTGG-3'   and   TSC2-ex33R: 5'-

TCCAGGGTCCCTGACTGTGA-3'. Screening by Sanger sequencing, using a nested primer

TSC2-ex33-seqF: 5'-TCGTCCTCAGTCTCCAGCC-3', identified one clone with successful

correction back to WT. For generating the *TSC2*-Null iPSC lines, we used a service provided

by an independent company (Alstem Cell Advancements, Richmond, CA). Briefly, *TSC2*-Het

iPSCs were co-transfected by nucleo-electroporation (Amaxa Nucleofector I) with a pair of

sgRNAs   targeting   *TSC2*   exon   2   (coding   exon   1)   including   sgRNA-1:   5'-

TGTTGGGACTGGGAACACCG-3' and sgRNA-2: 5'-ACTCACTCTCAGTATTTCCG-3'. A total

of 50 single clones were screened by PCR amplification and Sanger sequencing using primers

TSC2-F2:   5'-   CCATGGCCAAACCAACAAG-3'   and   TSC2-R2:   5'-

ACCTGGTGCAAGACCAAA-3', with 3 homozygous *TSC2*-Null clones identified, all of which

harbored the same 59 bp deletion in *TSC2* exon 2 resulting in a frameshift and premature

protein truncation.

Differentiation of iPSCs into NPCs

To generate NPCs, *TSC2*-iPSCs including the parental *TSC2*-Het line, the single *TSC2*-

WT clone and two of the three *TSC2*-Null clones (clones 5 and 39) were differentiated using

the directed monolayer differentiation protocol as we previously reported for TSC1-NPCs [29;

30]. Briefly, iPSCs expressing the pluripotency marker TRA-1-60 were sorted and enriched

using magnetic-activated cell separation (MACS) technology (Miltenyi Biotec). Cells were

cultured in neural induction medium (neurobasal medium supplemented with 1x neural

induction supplement (ThermoFisher)) for 7-9 days, followed by a second sorting for cells

expressing polysialylated-neural cell adhesion molecule (PSA-NCAM). The PSC-NCAM-

positive (+) cells then underwent a double-sorting to enrich for NPCs representing CD271(-)

/CD133(+) cells. NPCs were then cultured in neural expansion medium (1:1 neurobasal

medium:advanced DMEM/F12, 1x neural induction supplements (ThermoFisher) and 1x

penicillin/streptomycin (Corning)). MACS sorting was performed using microbead kits for TRA-

1-60, PSA-NCAM, CD271 and CD133 (Miltenyi Biotec).

Immunocytochemistry

To confirm successful derivation of NPCs, immunofluorescent staining was carried out

using NPC markers Nestin (EMD Millipore) and Sox2 (R&D Systems) antibodies as previously

described [29; 30]. Briefly, cells were fixed with 4% paraformaldehyde (PFA; Electron Microscopy

Sciences) and then permeabilized and blocked in a single step using PBS containing 4%

normal goat serum (NGS)/0.1% Triton-X-100. Primary antibodies were diluted into PBS

containing 2% NGS/0.1% Triton-X-100. DAPI (Invitrogen) was used to stain nuclei at 5 μg/ml.

Coverslips were mounted in ProLong Gold antifade Mountant (Invitrogen) and images were

captured using a Nikon Eclipse TE2000-U microscope and the NIS-Element BR 3.2 imaging

software.

Immunoblot analysis

Cells were lysed in RIPA lysis buffer (50 mM Tris (pH7.5), 150 mM NaCl, 0.1% SDS, 0.5%

sodium deoxycholate, 1% NP-40, 1x HALT phosphatase inhibitor cocktail (Pierce) and 1x

protease inhibitor cocktail (Sigma)) as previously described [31; 32]. Protein lysates were resolved

on 4-12% or 10-20% Novex WedgeWell Tris-glycine gels (Invitrogen), transferred to 0.45 μm

pore nitrocellulose (BioRad) and then incubated with primary antibodies to detect TSC2, pS6K

T389, S6K, pS6 S240/244, S6, p4E-BP1 S65, 4E-BP1, peIF4E S209, and eIF4E (Cell

Signaling Technologies); β-actin (Santa Cruz Biotechnology) or GAPDH (EMD Millipore). All

immunoblotting data shown are representative of at least 3 biological replicates.

Cell Size and proliferation

Cell size and proliferation were determined for *TSC2*-WT, Het and Null NPCs treated for

72 h with 50 nM rapamycin (MilliporeSigma), 10 nM RMC-6272 (generously provided by

Revolution Medicines Inc.) or DMSO as vehicle control. For both cell size and proliferation,

NPCs were analyzed by trypan blue exclusion using the Countess II automated cell counter

(ThermoFisher) as previously described [25; 29]. Briefly, cells were detached using Accutase

enzyme detachment medium (ThermoFisher), and for each sample, 10 μl of suspended cells

were combined with 10 μl of trypan blue, and then 10 μl of the resulting mixture was assessed

using the Countess II automated cell counter (ThermoFisher), according to the manufacturer's

instructions. Quantification of viable and dead cells was performed along with size of viable

cells. For proliferation, counting of viable cells collected at days (D) 1, 2, 3 and 4 after seeding

was performed for cells treated with 50 nM rapamycin, 10 nM RMC-6272 or DMSO on D1. All

data collected using the Countess II cell counter were analyzed from 3 independent

experiments (3 technical replicates each). Proliferation was further assessed using flow

cytometry employing the proliferation marker Ki-67 as previously described [25]. Briefly, *TSC2*-

WT, Het and Null NPCs were seeded onto Geltrex-coated plates followed by treatment with

50 nM rapamycin, 10 nM RMC-6272, 50 nM eFT-508 (Selleckchem) or DMSO as vehicle

control for 72 h (two biological replicates). To assess Ki-67 proliferation status, NPCs were

fixed with 4% PFA, permeabilized with ice cold 100% methanol to a final concentration of 90%

with gentle vortexing and stained using AlexaFluor (AF) 488-conjugated Ki-67 monoclonal

antibody or AF488-conjugated IgG as an isotype control (Cell Signaling Technologies). Data

were acquired from ~1×10^4 cells using a BD LSR II Flow Cytometer (BD Biosciences), and

analysis was carried out using FlowJo 10.8.1 (FlowJo LLC). Percentages of Ki-67 positive

cells (acquired through FITC channel) were determined by gating with respect to AF488-IgG

control.

Neurite outgrowth assay

NPCs were assessed for neurite outgrowth as previously described [29]. Briefly, NPCs were

seeded on coverslips coated with poly-D-lysine (0.1 mg/ml, Sigma) and fibronectin (5 μg/ml,

Corning) in growth factor-depleted neural expansion medium containing 1:1 neurobasal

medium:advanced DMEM/F12 (ThermoFisher), 0.3x neural induction supplements

(ThermoFisher) and 1x penicillin/streptomycin (Corning). Cells were treated with 50 nM

rapamycin, 10 nM RMC-6272 or DMSO vehicle control for 48 h followed by fixation with 4%

PFA prior to immunostaining. Three independent experiments were performed where images

were acquired from 8 non-overlapping fields and analyzed using HCA-Vision software V.2.2.0

(CSIRO, Canberra, Australia) [33]. Images were acquired using a Nikon Eclipse TE2000-U

microscope and NIS-Element BR 3.2 imaging software.

Polysome fractionation and RNA sequencing

Lysate were prepared for polysome profiling from three biological replicates as previously

described with minor modifications [34]. Briefly, TSC2-NPC lines were seeded at ~50,000

cells/cm^2, with a total of ~2.4×10^7 cells seeded per replicate for three drug treatment

conditions, including 10 nM RMC-6272, 50 nM eFT-508 or DMSO control. The day after

seeding, cells were treated for 2 h, rinsed with 1x PBS containing 100 μg/ml cycloheximide

(CHX) (Sigma), harvested by scraping on ice in PBS/CHX and pelleted by centrifugation at

300g for 10 min at + 4C. Cell pellets were first resuspended in hypotonic lysis buffer containing

5 mM Tris-HCl (pH 7.5), 2.5 mM $MgCl_2$ and 1.5 mM KCl, followed by addition of DTT (2 mM

final), CHX (100 μg/ml final), sodium deoxycholate (0.5% final) and Triton X-100 (0.5% final).

Lysates were then vortexed for 4 sec, cleared by spinning for 2 min at 13,000 rpm and quickly

frozen on dry ice. When ready for processing, lysates were quickly thawed at 37°C and loaded

onto a 10 - 50% sucrose gradient, followed by centrifugation for 2 h and 15 min at 35,000 rpm

in a SW41 rotor using a Sorvall Discovery 90SE centrifuge. The gradients were fractionated

on a Teledyne ISCO Foxy R1 apparatus while monitoring the OD254nm. Fractions

corresponding to mRNA associated with more than two ribosomes were pooled and the RNA

extracted using TRIzol (ThermoFisher) according to the manufacturer's protocol. 10% of the

lysate was removed from the extract prior to loading on the sucrose gradient, extracted using

TRIzol, and denoted as total RNA. RNA sequencing libraries were prepared from the resulting

samples (both polysome-associated and total RNA) using Illumina v2.5 Kits and sequenced

on an Illumina NextSeq 500 at the Canada's Michael Smith Genome Sciences Centre (BC

Cancer Research Institute, Vancouver, Canada).

RNA sequencing data preprocessing and quality control

Adapters were removed from RNA sequencing reads using bbduk.sh from the BBTools

software suite [https://www.osti.gov/servlets/purl/1241166] (v. 36.59 with settings: k = 13, ktrim

= n, useshortkmers = t, mink = 5, qtrim = t, trimq = 10, minlength = 20). Paired-end reads were

aligned to hg38 using HISAT2 [35] (ver 2.1.0 with settings: --no-mixed, --no-discordant), and

uniquely mapped reads were quantified using the featureCounts function from the RSubreads

package (v.2.6.4) [36] with RefSeq gene definitions and default settings. Polysome-profiling data

from the previous study of *TSC1*-dependent translation[25] were quantified using the same gene

definitions to allow a direct comparison to the herein generated dataset. Dataset reproducibility

was assessed using Principal Component Analysis using genes within the highest quartile of

standard deviations quantified across all samples as input.

Analysis of gene expression alterations using anota2seq

Gene expression quantified from polysome-associated and total mRNA was analyzed

using the anota2seq algorithm (v. 1.20.0) [37]. Batch effects were accounted for in the models

by including sample replicates using the "batchVec" argument in anota2seq. Default threshold

settings were used [settings minSlopeTranslation = -1, maxSlopeTranslation = 2,

minSlopeBuffering = -2, maxSlopeBuffering = 1, deltaPT = deltaP = deltaTP = deltaT =

log2(1.2), minEff=log2(1.5)] with a significance threshold maxRvmPAdj = 0.15 (corresponding

to a false discovery rate [FDR] < 0.15). Transcripts were classified into three modes of

regulation assessed by anota2seq (changes in mRNA abundance, changes in translation, and

translational offsetting) using the "anota2seqRegModes' function.

Analysis of gene signatures using empirical cumulative distribution functions

Empirical cumulative distribution functions (ECDFs) of log2 fold changes for polysome-

associated and total mRNA were plotted for gene signatures including ASD and NDD genes

[38], eIF4E overexpression [39], mTOR-sensitive genes [40] obtained from previous publications or,

to cross-compare datasets, genes that were found to be translationally regulated in either

dataset. The Wilcoxon rank-sum test was used to determine whether there was a significant

shift between each signature and the background (i.e. genes not within the signature).

Gene set enrichment analysis

Gene Ontology (GO) enrichment analysis was performed using genes classified as

regulated via translation by anota2seq (differentially translated genes, "DTGs") and annotation

from GO biological process (GO:BP) terms retrieved from MSigDB database (v. 2023.2.Hs) [41]

using one-tailed Fisher's exact test. In this analysis, only GO:BP terms with at least 10 genes

within the background set (all detected genes analyzed by anoat2seq) of a particular

comparison were considered. DTG datasets for GO analysis included *TSC2*-Null vs WT NPCs,

TSC2-Null NPCs treated with RMC-6272 vs DMSO control, *TSC2*-Null NPCs treated with eFT-

508 vs DMSO control, pairwise comparison between *TSC2*-Null NPCs treated with RMC-6272

or eFT-508 as well as pairwise comparisons between *TSC2*-Null vs WT NPCs and our

previously published dataset comparing *TSC1*-Null vs WT NPCs [25]. In addition, genes were

ranked based on fold-changes for translation determined by anota2seq analysis for a given

comparison. The analysis utilized ASD-, NDD- and EPI-associated gene sets. This was

conducted using the fgsea package (v.1.24.0, https://doi.org/10.18129/B9.bioc.fgsea) within

the R environment. For each gene set, the Normalized enrichment score (NES) and FDR were

calculated.

Enrichment analysis for selected DTGs identified by anota2seq and target gene sets,

including ASD-, NDD-, EPI-associated genes [38; 41; 42] and eIF4E-sensitive genes [39], was

performed using one-tailed Fisher's exact test. Statistical significance of overlaps between the

two DTG datasets was also assessed using one-tailed Fisher's exact test. Here, all anota2seq

analyzed genes in a single comparison, or intersection of anota2seq analyzed genes in paired

comparisons, constituted the background sets. These enrichment analyses were performed

in the R statistical software environment (version 3.4.3) (https://www.R-project.org/) using

custom scripts.

Validation of differential translation using RT-qPCR

For validation, polysome fractionations were collected from *TSC2*-Null or *TSC2*-WT NPCs

(three biological replicates), and RNA was isolated as described for NPCs above. cDNA was

prepared using M-MuLV Reverse Transcriptase (New England Biolabs) and oligo(dT)20

primers using the manufacturer's recommendations. RT-qPCRs were performed with SsoFast

EvaGreen Supermix using the CFX96 PCR system (Bio-Rad). Primers for RT-qPCR are

detailed in Table S1. The level of each mRNA was normalized to β-actin (*ACTB* [MIM: 102630])

and Phosphoglycerate Kinase 1 (*PGK1* [MIM: 311800]) using the comparative CT method and

compared across conditions as indicated in the figure legend.

Statistical analyses

Methods for statistics are described above, or in corresponding figure legends.

RESULTS

***Establishment of an isogenic set of TSC2 patient-derived neural progenitor* cells**

We generated an isogenic set of TSC2 patient-derived NPCs using a similar approach as

we described previously for TSC1 patient-derived NPCs [25; 29]. Primary fibroblasts cultured from

post-mortem SUF tissue were found to harbor a germline heterozygous 1 bp deletion in *TSC2*

exon 34 (originally reported as coding exon 33) with no loss-of-heterozygosity [26]. Induced

pluripotent stem cells (iPSCs) were generated from the fibroblasts, followed by CRISPR-

based genome editing that demonstrated (i) correction of the heterozygous mutation back to

wildtype, or (ii) knock out of the second allele due to a 59 bp deletion in *TSC2* exon 2 (coding

exon 1). This resulted in an isogenic set of iPSCs representing the parental *TSC2*-Het line, a

single clone of *TSC2*-corrected (*TSC2*-WT) and three clones of *TSC2*-Null iPSCs. We then

selected *TSC2*-WT, Het and two Null iPSC clones (clones 5 and 39) for microbead sorting of

neural cell surface protein markers to obtain NPCs as previously described [29]. Immunostaining

for neural markers Nestin and Sox2 confirmed successful NPC derivation (Figure S1A). Loss

of TSC2 protein expression was confirmed in *TSC2*-Null clones when compared with the

TSC2-WT (Figure S1B). We also observed increased phosphorylation of mTORC1 targets

p70S6K (pS6K T389), pS6 S240/244 and p4E-BP1 S65 in both *TSC2*-Null NPC clones

compared with *TSC2*-WT NPCs, consistent with activation of mTORC1 signaling, while *TSC2*-

Het NPCs revealed only minimal activation of mTORC1, which is in agreement with several

reports that employed human iPSC models of TSC [43-46] (Figure S1B). *TSC2*-Null NPCs

demonstrated an enlarged cell phenotype compared with *TSC2*-WT cells (Figure 1B, D), which

is a hallmark of mTORC1 activation. *TSC2*-Het NPCS exhibited an intermediate cell size

phenotype (Figure 1B, D). Treatment with rapamycin or RMC-6272 attenuated

phosphorylation of S6K at T389, along with its downstream substrate ribosomal protein S6

(pS6 S240/244) and rescued the enlarged cell size (Figure 1C, D). As expected, rapamycin

showed only minimal effects on phosphorylation of 4E-BP1 while RMC-6272 demonstrated

complete inhibition (Figure 1C). These results are consistent with our observations in TSC1-

NPCs [25] and with previous studies showing that the mTORC1-S6K signaling axis controls cell

size [47].

Rescue of early neurodevelopmental phenotypes by RMC-6272, but not rapamycin

We previously demonstrated that defects in early neurodevelopmental phenotypes in

TSC1-Null NPCs, including increases in proliferation rate and neurite outgrowth, could be

rescued by RMC-6272 treatment, but not rapamycin. This suggests dependence, at least in

part, on the mTORC1-4E-BP1 signaling axis [25; 29]. Here, we assessed proliferation by viable

cell count in TSC2-NPCs over the course of four days (D1-4) after seeding, also comprising a

72 h treatment with 50 nM rapamycin, 10 nM RMC-6272 or DMSO control initiated at D1. We

observed genotype-dependent changes in cell numbers in vehicle-treated cells whereby

TSC2-Null NPCs showed significantly increased proliferation relative to *TSC2*-WT NPCs with

TSC2-Het also showing augmented proliferation as compared to *TSC2*-WT NPCs (Figure 2A,

left graph region). When compared with DMSO treatment, rapamycin showed no significant

effect in *TSC2*-WT, -Het or -Null NPCs (Figure 2A, center compared with left graph regions);

whereas RMC-6272 demonstrated significant reduction by D3 in all three NPC genotypes,

with the maximal decrease observed in *TSC2*-Null NPCs (Figure 2A, right compared with left

graph regions). Consistent with this, flow cytometry-based analysis showed a reduction in the

percentage of S phase-positive cells (as indicated by Ki-67 positive staining) in RMC-6272 vs

DMSO treated *TSC2*-WT (50.9% vs 62.7%), *TSC2*-Het (56.2% vs 64.9%) and *TSC2*-Null

(53.7% vs 68.9%) NPCs. In contrast, similar percentages of Ki-67 positivity were found for

rapamycin or DMSO treatment (Figure S2A). Moreover, treatment with eFT-508/tomivosertib,

a MNK1/2 inhibitor, which attenuates phosphorylation of eIF4E at S209 (peIF4E S209) but not

4E-BP1 (p4E-BP1 S65) did not alter Ki-67 positivity in *TSC2*-Null NPCs (Figure S2A, B).

We next assessed neurite outgrowth in isogenic TSC2-NPCs using MAP2 immunostaining

and HCA-Vision image analysis software to quantitate three parameters (as an average per

cell): (i) length of neurite outgrowth, (ii) number of neurite roots and (iii) number of extremities

(terminal endpoint of primary and branched outgrowths). In TSC2-NPCs treated for 48 h with

DMSO, a significant increase in neurite length/cell of ~3.2-fold in *TSC2*-Null and an

intermediate increase of ~1.4-fold in *TSC2*-Het was observed relative to *TSC2*-WT NPCs

(Figure 2B, C). *TSC2*-Null NPCs also revealed a significant increase in neurite number/cell

(~1.5-fold) and extremities/cell (~1.7-fold) relative to *TSC2*-WT NPCs (Figure 2B, C). Upon

RMC-6272 treatment, we observed decreases in neurite length, number and extremities of

0.73, 0.90 and 0.83, respectively, for *TSC2*-Het NPCs, and 0.46, 0.68 and 0.64, respectively,

for *TSC2*-Null NPCs (Figure 2D). Similar to the proliferation assays, rapamycin failed to rescue

neurite-related phenotypes, and in fact showed an opposite trend in several parameters

(Figure 2D). Taken together, these data support that the third-generation mTORC1 inhibitor

RMC-6272 more effectively reverses the early neurodevelopmental phenotypes observed in

TSC2-NPCs, and that this effect is dependent on a more potent inhibition of mTORC1-4E-BP

signaling.

Abundant mRNA translation alterations in* TSC2-*Null NPCs largely overlap with those

observed in* TSC1-*Null NPCs

Our findings above demonstrate activation of mTORC1 signaling and increases in

proliferation and neurite outgrowth in *TSC2*-Null NPCs, compared with WT cells. As mRNA

translation is a major downstream target of mTORC1, it is necessary to study how both mRNA

levels and translation are affected by *TSC2* loss to disentangle gene expression-dependent

effects on cellular phenotypes. We therefore applied polysome-profiling in *TSC2*-Null and

TSC2-WT NPCs. Cytoplasmic mRNA was fractionated based on ribosome-association and

the resulting polysome-associated (herein mRNA associated with >2 ribosomes) and total

cytoplasmic mRNA pools were then quantified using RNA sequencing followed by anota2seq

analysis [37; 48]. This allowed identification of *TSC2*-associated alterations in (i) "translation",

defined as polysome-associated mRNA alterations not paralleled by corresponding changes

in total mRNA levels; (ii) "abundance", representing congruent modulation of total and

polysome-associated mRNA; and (iii) "offsetting", defined as alterations in total mRNA not

paralleled by corresponding changes in polysome-associated mRNA. This analysis revealed

numerous *TSC2*-associated alterations in mRNA translation visualized using a scatterplot

comparing *TSC2*-dependent changes in polysome-associated and total mRNA (Figure 3A;

Table S4) and densities of p-values and false discovery rates (FDRs) obtained from anota2seq

analysis (Figure 3B). These alterations in translation occurred alongside less abundant

changes in mRNA levels and essentially in absence of translational offsetting (Figure 3A).

Although the analysis is expected to be hampered by the large number of regulated genes,

we used gene ontology analysis to identify cellular functions targeted by these changes in

translation. This revealed that translationally suppressed transcripts encode proteins enriched

for annotation to cellular functions including protein DNA complex organization, chromatin

remodeling, RNA metabolism, and cell cycle while those involved in a variety of metabolic

processes were translationally activated (Figure 3C).

To assess how these *TSC2*-associated alterations in mRNA translation compare to our

previously described *TSC1*-associated changes, we looked for differences in the response to

loss of *TSC1* vs *TSC2* relative to their respective control conditions (i.e. the interaction effect)

using an anota2seq-like approaches we described previously [49]. Strikingly, only one gene

showed a statistically significant difference in translation response upon *TSC1* vs *TSC2* loss

(at FDR < 0.15), and this analysis therefore argues for largely overlapping effects on mRNA

translation. To further assess this, we generated gene signatures of transcripts that were

translationally up or downregulated in *TSC1*-Null or *TSC2*-Null NPCs relative to their controls

and visualized how these gene sets were regulated across the two models. This revealed that

transcripts whose translation was activated or suppressed in *TSC2*-Null NPCs showed similar

regulation in *TSC1*-Null NPCs and, vice versa, transcripts whose translation was activated or

suppressed in *TSC1*-Null NPCs showed similar regulation in *TSC2*-Null NPCs (Figure 3D).

Yet, there were differences in mRNA level changes for these subsets (compare Figure 3D left

and right plots) that, together with expected threshold-effects, resulted in a smaller set of 949

translationally suppressed and 189 translationally activated transcripts that passed threshold

applied in anota2seq for both comparisons (Figure 3E). As expected, these shared genes

were enriched in similar gene ontology categories as those identified upon *TSC2* loss (Figure

3F). In aggregate, these results indicate extensive remodeling of mRNA translation in *TSC2*-

Null NPCs largely recapitulating that observed in *TSC1*-Null NPCs.

Suppressed translation of mRNAs encoding proteins associated with ASD and NDD

upon* TSC2 *loss

To explore the relationship between altered gene expression associated with *TSC2* loss

and patient phenotypes we reasoned that *TSC2* loss may affect translation of mRNAs

encoding proteins implicated in non-syndromic autism spectrum disorder (ASD), general

neurodevelopmental disorders (NDD) and/or epilepsy. To assess this, we utilized data from

recent studies that identified high confidence *de novo* mutations in large cohorts of individuals

diagnosed with ASD, NDD as well as epilepsy. For ASD/NDD-related genes, we used datasets

reported by Fu and colleagues, including 72 genes associated with ASD (ASD72) and 373

genes associated with NDD (NDD373) identified at a stringent FDR $\leq$ 0.001 threshold, as well

as 185 ASD-associated genes (ASD185) and 664 NDD-associated genes (NDD664) at

reduced stringency (FDR $\leq$ 0.05) [38]. For epilepsy-related genes, we used genes categorized

by the Epi25 Collaborative (http://epi-25.org/genes-in-epilepsy) and reported by Chen and

colleagues [42] that consists of 83 genes identified at p $\leq$ 0.005 by whole-exome sequencing

(case-control study) in the full epilepsy cohort (EPI). We next assessed whether expression of

ASD-, NDD- and epilepsy-associated genes is regulated in *TSC2*-Null NPCs as determined

by anota2seq analysis (i.e. from Figure 3A). This analysis revealed significant enrichments of

ASD72 (~43% of all ASD72 genes; p = 1.72×10^{-7}) and NDD373 (~37% of all NDD373 genes;

p = 2.59×10^{-19}) genes among translationally suppressed transcripts as compared to

background (Table 1). This finding was further substantiated by applying two approaches that

do not use thresholds to identify sets of differentially regulated genes: i) gene set enrichment

analysis (GSEA) [41] (Figure 4A) and ii) the same method as applied for *TSC1* vs *TSC2* (i.e.

Figure 3D) gene subset-comparisons (Figure 4B, top). Both these approaches showed strong

enrichment of ASD72 and NDD373 genes among transcripts translationally suppressed in

TSC2-Null as compared to isogenic WT NPCs. Similarly, in *TSC2*-Null NPCs, strong

enrichments among translationally suppressed genes were observed for the larger ASD185

and NDD664 gene sets (Table S2A; Figure S3A, B). ASD- and NDD-associated genes were

also enriched among transcripts that were translationally suppressed in both *TSC2*-Null and

TSC1-Null NPCs relative to their respective controls (i.e. genes from Figure 3E; Table S2B).

A similar analysis for EPI-associated genes revealed a smaller enrichment (~27% of all EPI-

associated genes; p = 5.82×10^{-3}) (Table 1) that was not confirmed using methods that do not

use thresholds to identify regulated sets of genes (Figure S3C, D).

To assess whether this unexpected translational suppression of ASD- and NDD-

associated genes in NPCs occurs in the presence of expected effects on mRNA translation

from mTORC1 activation, we applied the same approaches described above to sets of

transcripts whose translation was altered following overexpression of eIF4E [39]. Consistent with

activation of the mTORC1-eIF4F axis controlling translation in *TSC2*-Null NPCs, there was a

strong overlap between genes whose translation was activated upon eIF4E-overexpression

and *TSC2* loss (Table S3). A similar result was obtained when only considering genes that

were identified as translationally regulated by anota2seq following both *TSC1* and *TSC2* loss

(i.e. from Figure 3E; Table S3) and when a method not relying on thresholds was used (Figure

4B, middle) as well as when using an additional signature of mTORC1-sensitive translation

reported previously [14] (Figure 4B, bottom). Therefore, interestingly, genes associated with

ASD and NDD are largely translationally suppressed in NPCs following inactivation of *TSC2*

despite appropriate activation of mTORC1-sensitive translation.

5'UTRs of ASD and NDD genes resemble those of mRNAs whose translation is

suppressed upon activation of mTORC1

The above results unveiled that translation of mRNAs encoding proteins associated with

ASD and NDD is affected by the activity of mTORC1. As mTORC1-sensitive translation largely

relies on features in the 5'UTR, this suggests that the observed suppressed translation of

ASD- and NDD-associated genes may depend on their 5'UTRs. As mentioned above, mRNAs

whose translation parallels activity of mTORC1 often have short and/or highly structured

5'UTRs and lack upstream open reading frames (uORFs). Strikingly, ASD- and NDD-

associated genes showed an opposite profile for 5'UTR length, GC-content (which associates

with secondary structures of the 5'UTR) and uORFs that was more similar to mRNAs whose

translation was suppressed upon *TSC2* loss (Figure 4C-E). Therefore, ASD- and NDD-

associated genes largely show 5'UTRs that are consistent with translational suppression

following increased activation of mTORC1.

RMC-6272 and eFT-508 treatment reverses* TSC2*-dependent translation and

encompasses ASD- and NDD-associated genes

The findings above suggest that suppressed translation of ASD- and NDD-associated

genes following loss of *TSC2* may be important for neurodevelopmental manifestations.

Furthermore, this raises the possibility that inhibition of mTORC1 signaling, or potentially other

key pathways modulating translation, may reverse *TSC2*-dependent translation of ASD- and

NDD-associated genes. To assess this, we performed polysome-profiling in *TSC2*-Null NPCs

treated with mTORC1 inhibitor RMC-6272, or the MNK1/2 inhibitor eFT-508. The resulting

dataset was analyzed as described above using anota2seq to determine how these agents

modulate gene expression. Both treatments resulted in dramatic mRNA translation changes

as visualized in scatterplots comparing effects in polysome-associated and total mRNA levels

as well as p-value and FDR densities (Figure S4A-D). Next, we generated gene signatures of

transcripts that were translationally increased or decreased in *TSC2*-Null NPCs treated with

RMC-6272 relative to DMSO control and determined how these gene sets were regulated in

TSC2-Null NPCs treated with eFT-508 vs DMSO control. This revealed that transcripts whose

translation was activated or suppressed by RMC-6272 showed similar regulation upon eFT-

508 treatment and, vice versa, transcripts whose translation was activated or suppressed by

eFT-508 showed similar regulation upon RMC-6272 treatment (Figure 5A, B). Yet, these

overlaps were partial as subsets of transcripts that were altered in one treatment group did

not shift in the other treatment group (Fig. 5A and B). To determine whether the agents

reversed *TSC2*-sensitive translation, we used the same strategy as above when comparing

TSC1- vs *TSC2*-sensitive translation (i.e. Figure 3D). This revealed that both RMC-6272 as

well as eFT-508 partially reversed *TSC2*-sensitive translation (Figure 5C). Gene ontology

analysis of genes overlapping in *TSC2*-Null NPCs treated with RMC-6272 or eFT-508

revealed significant reversal of some cellular functions that were identified as *TSC2*-

dependent (shown in Figure 3C), including positive regulation of transcription by RNA

polymerase II, positive regulation of RNA metabolic process and protein DNA complex

organization along with transcripts involved in various metabolic processes (Figure 5D).

By comparing anota2seq outputs for these analyses, we observed that among all

transcripts whose translation was increased in *TSC2*-Null cells (Figure 3A), 614 (~47%) or

936 (~71%) were suppressed upon RMC-6272 or eFT-508 treatment, respectively, with an

overlap of 513 transcripts. Similarly, among all transcripts whose translation was decreased

in *TSC2*-Null cells, 1454 (~57%) or 1177 (~46%) were translationally activated upon RMC-

6272 or eFT-508 treatment, respectively, with an overlap of 874 transcripts (all overlaps were

statistically significant; Figure S4E; Table S4)**.** Gene ontology analyses of *TSC2*-associated

changes in translation (from Fig. 3A) that were distinctly reversed upon treatment with either

RMC-6272 or eFT-508 revealed significant reversal of enriched annotations upon treatment

with RMC-6272 or eFT-508 as well as reversal of key cellular functions shown in Figure 3C

(Figure S4F, G).

Although the inhibitors led to altered translation of similar numbers of transcripts in *TSC2*-

Null NPCs, anota2seq analysis contrasting the two treatments revealed notable differences in

terms of affected mRNAs (Figure S5A, B). This was further substantiated by gene ontology

analyses, which revealed that while RMC-6272 more efficiently suppressed translation of

mRNAs encoding proteins involved in translation and oxidative phosphorylation, eFT-508

more efficiently suppressed translation of mRNAs relating to neuronal development (Figure

S5C).

Next, we assessed whether translation of mRNAs encoding ASD- and NDD-associated

genes were affected by mTORC1 and/or MNK1/2 inhibition. This revealed a striking reversal

in translation of both ASD and NDD genes in *TSC2*-Null NPCs treated with RMC-6272 or eFT-

508 (Figure 6A). To identify affected genes, we compared outputs from the corresponding

anota2seq analyses. Among the 31 ASD72 genes translationally suppressed in *TSC2*-Null

NPCs, 28 (~90%) and 18 (~58%) were translationally activated upon RMC-6272 (RMC-

responsive) and eFT-508 treatment (eFT-responsive), respectively. While all eFT-responsive

genes were identified as RMC-responsive, 10 genes were only responsive to RMC-6272

(Table 1; Figure 6B). Moreover, for translationally suppressed NDD373 genes, 96 (~70%) and

69 (50%) were RMC- and eFT-responsive (Table 1), respectively (60 were both RMC- and

eFT-responsive; similar results were obtained for ASD185 and NDD664 genes; Table S2A).

To validate alterations in translation upon *TSC2* loss as well as the reversal following mTORC1

or MNK1/2 inhibition, we selected five representative ASD/NDD-associated genes that were

translationally suppressed in *TSC2*-Null NPCs: *SETD1B* [MIM: 611055], *DYRK1A* [MIM:

600855], *CHD8* [MIM: 610528], *NRXN1* [MIM: 600565] and *TCF7L2* [MIM: 62228], and also

five eIF4E-sensitive genes that were translationally activated in *TSC2*-Null NPCs: *AP2S1*

[MIM: 602242], *LZTR1* [MIM: 600574], *WDR54*, *ALDOC* [MIM: 103870] and *EIF2B2* [MIM:

606454]. Quantitative RT-PCR (RT-qPCR) analysis from polysome-associated mRNA

fractions (>2 ribosomes), adjusted for alterations in total mRNA, normalized to housekeeping

gene, *ACTB* showed a reduction for all five ASD/NDD-related genes and increase in all five

eIF4E-sensitive genes in *TSC2*-Null vs WT NPCs, confirming the above polysome-profiling

results. Moreover, RMC-6272 or eFT-508 reversed *TSC2*-associated translationally

suppressed ASD/NDD and translationally activated eIF4E-sensitive genes (Figure 6C).

Similar results were obtained when normalized to a second housekeeping gene *PGK1* (data

not shown).

Taken together, *TSC2*-dependent decreased translation of mRNAs associated with ASD

and NDD can be reversed upon RMC-6272 or eFT-508 treatment in NPCs. These results are

intriguing and potentially imply paradoxically suppressed translation of a subset of

neurodevelopmentally important genes that nonetheless depend on mTORC1-eIF4F pathway

activation.

DISCUSSION

The central role of mTORC1 signaling in translation initiation and protein synthesis in a

variety of cell types including stem cells, as well as in human disease, is well established [11; 50;

51]. While many transcriptome-wide studies have been reported in *TSC1/2*-deficient neuronal

cells, how *TSC2* loss affects mRNA translation, particularly in patient-derived cells, is

unknown. We recently reported *TSC1*-dependent alterations in mRNA translation employing

an isogenic set of CRISPR-modified, TSC1 patient-derived NPCs. Although polysome-

profiling revealed a partial reversal of *TSC1*-associated gene expression changes following

rapamycin treatment, most genes related to neural activity/synaptic regulation or ASD

remained rapamycin-insensitive [25]. Here, we describe generation and characterization of an

independent isogenic set of CRISPR-modified NPCs from a TSC patient with a loss-of-function

germline mutation in *TSC2*. We find that *TSC2*-Null NPCs mimic *TSC1* loss in activation of

mTORC1 signaling and early neurodevelopmental phenotypic changes [25]. Rapamycin

treatment of *TSC2*-Null NPCs fully inhibited phosphorylation of S6K and reduced enlarged cell

size but had minimal effects on 4E-BP1 phosphorylation and early neurodevelopmental

phenotypes. In contrast, the third-generation mTORC1 inhibitor RMC-6272 revealed efficient

inhibition of both S6K and 4E-BP1 phosphorylation and rescued these phenotypes as well as

cell size. These data suggest that while enlarged cell size observed upon *TSC2* loss depends

on the mTORC1-S6K axis of the pathway, which is consistent with previous reports [47], the

altered neurodevelopmental phenotypes depend on the mTORC1-4E-BP1 signaling axis.

We observed dramatic changes in mRNA translation associated with *TSC2* loss in NPCs

that largely overlapped with those observed upon *TSC1* loss. Provided that *TSC1* and *TSC2*

loss-assert similar effects on mTORC1 signaling, a substantial overlap is expected. Importantly

as the cells were derived from independent patients, our results support a robust effect on

mRNA translation across patients with hyperactive mTORC1 activity. In this study, in addition

to RMC-6272, which inhibits mTORC1 activity, we also considered alternative approaches to

modulate activity of the eIF4F complex and therefore included the MNK1/2 inhibitor eFT-

508/tomivosertib to understand a possible convergence of mTORC1-4E-BP1 and MNK-eIF4E

signaling pathways on *TSC2*-dependent protein synthesis (see Figure 1A). While mTORC1-

sensitive translation has been studied extensively at the transcriptome-wide level [22; 40; 52; 53],

the understanding of how the MNK-eIF4E axis modulates mRNA translation at a global scale

is more limited [16]. This study is the first that includes a direct comparison of these pathways

to assess effects on mRNA translation at a transcriptome-wide level, and the results reveal

that a large proportion of translational alterations observed in *TSC2*-Null NPCs can be

reversed by RMC-6272 or eFT-508, suggesting that these changes are mediated by

mTORC1-4E-BP1- and MNK-eIF4E-dependent activation of eIF4F complex. However, the

activity of the two inhibitors is not equivalent since RMC-6272 would be expected to affect

both eIF4E-dependent and S6K-dependent translation whereas eFT-508 would be restricted

to MNK1/2-dependent translation. We also observe ample differences between the two drugs

with respect to translation, which are in line with previous studies showing differences in

affected cellular phenotypes as the mTORC1-4E-BP1 axis is a key regulator of cell cycle

progression [19; 54] while MNK1/2-eIF4E controls cell migration [55; 56].

As epilepsy and ASD are strongly associated with TSC, we compared transcripts that were

differentially translated in *TSC2*-Null vs WT NPCs to recent genetic datasets available from

large cohorts of individuals with ASD, NDD and epilepsy [38; 42]. Interestingly, numerous non-

monogenic ASD-, NDD- and epilepsy-associated genes identified in patients harboring

putative loss-of-function mutations, including protein truncating or damaging missense

variants, were translationally suppressed in *TSC2*-Null NPCs and overlapped with data from

our previously reported *TSC1*-model. Notably, the results for ASD- and NDD-associated

genes were confirmed using multiple methods, which suggests that for these subsets there is

a strong negative regulatory effect on mRNA translation impacting a large proportion of these

mRNAs. This was not the case for epilepsy-associated genes, in that a smaller fraction of

these genes was translationally suppressed upon *TSC2* loss. Importantly, these decreases in

translation were observed side-by-side with the expected increased translation of mRNAs that

were previously reported to be translationally activated upon mTORC1 pathway activation.

This suppressed translation was, for a majority of identified ASD/NDD genes, reversed by

inhibition of mTORC1 using RMC-6272 or MNK1/2 using eFT-508. A recent elegant large-

scale transcriptome study demonstrated that CRISPR perturbation of several ASD genes

results in differential expression of ASD/NDD-related genes that positively correlate with co-

expression of the perturbed gene, thereby establishing a high level of convergence across

ASD risk genes [57]. Our results here showing translational suppression of many ASD/NDD

genes upon loss of *TSC2* is consistent with the positive correlation and co-expression reported

by Liao and colleagues [57]. However, most notably, our results demonstrate that a majority of

translationally suppressed ASD/NDD/epilepsy genes can be reversed by RMC-6272 or eFT-

508, thereby establishing the roles of mTORC1-4E-BP1 and MNK-eIF4E in regulating

translation of these genes.

Many of the translationally suppressed ASD genes are FMRP targets. FMRP was

originally considered to function as a translational repressor that can bind to numerous mRNAs

that are generally larger than average and enriched for genes associated with ID and ASD [58;

59]. However, recent studies of FMRP-deficiency have documented a decrease in translation

initiation rates of many FMRP targets including ASD-related genes, which contrasts the notion

that FMRP is solely a translational repressor and supports a model where FMRP can also

function to increase the translation initiation of many targets [60-63]. Furthermore, in *TSC2*-Null

NPCs we also observe that 32 translationally suppressed ASD/NDD-related genes are

associated with chromatin-remodeling [64; 65]. Additional studies are therefore necessary to fully

comprehend how the ASD- and NDD-associated genes are translationally suppressed upon

loss of *TSC2*.

In the literature, the focus has been, in general, towards understanding mechanisms

underlying transcript-selective translation paralleling mTORC1 activity [13] while less attention

has been given to transcript that show decreased translation upon mTORC1 activation.

Translation of mRNAs enriched for 5'UTRs containing uORFs are translationally suppressed

upon mTORC1 activation [40]. In agreement, we observed an increased frequency of uORFs in

both ASD- and NDD-associated genes; however, it should be noted that uORFs are also

common among background transcripts, and a relatively large proportion of ASD- and NDD-

associated genes do not have uORFs in their 5'UTRs.

Our results raise the critical question as to how ASD/NDD-related genes are translationally

suppressed upon mTORC1 activation in *TSC2*-Null NPCs. In addition to mTORC1 signaling,

the integrated stress response (ISR) pathway, which selectively modulates translation of

transcripts with 5'UTRs harboring uORFs [66], is a key regulator of mRNA translation. In

response to cellular stress, a decrease in global protein synthesis is paralleled by increased

translation of mRNAs with 5'-uORFs including the transcription factor ATF4 (reviewed in [67]);

therefore, further studies are need to examine involvement of the ISR pathway in our TSC

models. Furthermore, alternative mechanisms such as DAP5-dependent translation, which

can be activated under low mTORC1 signaling, may also play a role [53].

Another potential mechanism of translational regulation is via microRNAs (miRNAs), which

are involved in neurodevelopmental disorders [68]. Among 31 translationally suppressed

transcripts in *TSC2*-Null NPCs that show strong association with ASD (ASD72, FDR<0.001),

28 are predicted to be targeted by at least one miRNA, using the miTarBase 2017 library (data

not shown). Interestingly, of the individual miRNAs identified by miTarBase analysis, four (hsa-

miR-27b-3p, hsa-let-7g-3p, hsa-miR-29a-3p and hsa-miR-515-5p) were reported as increased

upon *TSC1*- or *TSC2*-shRNA suppression in human neural stem cells generated from skin

fibroblast-derived iPSCs (p <0.05) [69]; and three (hsa-miR-21-5p, hsa-miR-19b-3p and hsa-

miR-144-3p) were shown to be overexpressed in human autism brain samples [70]. Based on

this, it is tempting to speculate that miRNAs may play a role in suppressing translation in

TSC2-Null NPCs, and future studies will address this mechanistic possibility.

In summary, we establish that loss of *TSC2* in patient-derived NPCs results in numerous

changes in mRNA translation, which significantly overlap with loss of *TSC1*. Loss of *TSC2*

associates with suppressed translation of a large proportion of ASD- and NDD-related genes,

which is reversed by inhibition of mTORC1 or MNK1/2, demonstrating the importance of

eIF4F-dependent mRNA translation in neurodevelopmental disorders. Our work also supports

the therapeutic potential for RMC-5552 (the clinical counterpart of RMC-6272) and eFT-

508/tomivosertib that are currently under clinical development for cancer, as a strategy for

treatment of TSC-associated neuropsychiatric disorders as well as ASD and other

neurodevelopmental disorders.

DECLARATION OF INTERESTS

The authors declare no competing interests.

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AUTHOR CONTRIBUTIONS

Conceptualization and study design: V.R. and O.L.; experimental methods and data

acquisition P.M., K.S., F.R., S.B., R.B., N.R., J.B., S.C. and I.N.; data analysis and

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preparation and editing: P.M., K.S., F.R., S.B., R.B., I.N., S.H., S.E., O.L. and V.R.

WEB RESOURCES

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NCBI GenBank, https://www.ncbi.nlm.nih.gov/genbank/

Sequences,https://www.ncbi.nlm.nih.gov/nuccore/NM_000548

GenScript, https://www.genscript.com

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fgsea package (v.1.24.0), https://doi.org/10.18129/B9.bioc.fgsea

R statistical software environment, https://www.R-project.org/

DATA AND CODE AVAILABILITY

The polysome-profiling datasets supporting the conclusions of this article are included

within the article (and its additional file(s)), and the full datasets will be deposited into Gene

Expression Omnibus (GEO).

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FIGURE TITLES AND LEGENDS

Figure 1. Inhibition of mTORC1 using RMC-6272 or rapamycin rescues increased cell

size in *TSC2*-mutant NPCs.

(A) Schematic representation of how mTORC1 signaling modulates mRNA translation.

Inhibitors used to target the pathway axes are indicated in red.

(B) Representative bright field images, including enlarged inset images (black boxed regions),

are shown for *TSC2*-Het and -Null NPCs compared with *TSC2*-WT cells. Scale bar=100µm.

(C) Immunoblotting of an isogenic set of *TSC2*-WT, -Het and -Null (cl. 39) NPCs, following 24

h treatment with DMSO (control), rapamycin (50nM) or RMC-6272 (10nM) are shown for

TSC2/tuberin as well as mTORC1 pathway readouts pS6K T389, pS6 S240/244 and p4E-BP1

S65 along with respective total proteins.

(D) Average cell size for *TSC2*-Het and -Null NPCs relative to *TSC2*-WT cells following a 48

h treatment with DMSO (control), rapamycin or RMC-6272 (same concentrations as in C) was

quantitated, and data represents the mean ($\pm$SEM) from 3 independent experiments, each

with triplicate technical replicates. P-values of comparisons (*$p<0.05$, **$p<0.01$, ***$p<0.001$)

from Student's t-test are indicated.

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Figure 2. Altered neurodevelopmental phenotypes in *TSC2* mutant NPCs are rescued

by RMC-6272, but not rapamycin.

(A) Proliferation by live cell counting (trypan blue exclusion) was carried out over days D1-4

in *TSC2*-WT, -Het and -Null NPCs under control treatment (left graph region), or treatment

initiated at D1 with rapamycin (50 nM, middle graph region) or RMC-6272 (10 nM, right graph

region). Quantitation for each timepoint is normalized to cell seeding number (D0=1). Data

represent the mean (+SEM) from 3 independent experiments (3 replicates/cell

line/experiment). Student's t-test p-values (*p<0.05, **p<0.01, ***p<0.001) are indicated in

DMSO-treated NPCs (left graph region) for increasing cell numbers in *TSC2*-Het and Null

NPCs at each timepoint (D1-4) relative to *TSC2*-WT NPCs at the respective timepoint. For

drug-treated NPCs (middle and right graph regions), within each genotype, p-values are

indicated for changes in cell numbers relative to DMSO controls at the corresponding

timepoint.

(B) Representative images of immunofluorescence staining in NPCs using neuronal marker

MAP2 (gray), performed 48 h after initiating nerite outgrowth, are shown along with traced

images generated employing HCA-Vision image quantitation software (green), which traces

the cell body along branching layers of the neurite arborization. Scale bar = 100 μm.

(C and D) Bar plots indicate average neurite length (left panel), average neurite number

(center) and extremities (right) per cell for *TSC2*-Het and -Null NPCs relative to *TSC2*-WT

NPCs under control conditions (C) or for rapamycin (50 nM) or RMC-6272 (10 nM) treatment

in *TSC2*-Het and -Null cells relative to DMSO control (D) . Data represents mean (+SEM) from

3 independent experiments (8 non-overlapping image fields/cell line/experiment). P-values

from Student's t-test (*p<0.05, **p<0.01, ***p<0.001) are shown.

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Figure 3. Extensive remodeling of mRNA translation in *TSC2*-Null NPCs aligns with

those observed following loss of *TSC1*.

(A) Scatterplot of polysome-associated mRNA vs total mRNA log2 fold changes between

TSC2-Null (-/-) and WT NPCs. Genes are colored according to their mode of regulation as

identified by the anota2seq analysis (FDR < 0.15). The number of mRNAs regulated via

translation, mRNA abundance or offsetting is indicated.

(B) Kernel densities of p-values and FDRs (from anota2seq analysis) for the comparison of

TSC2-Null vs WT NPCs. Densities are shown for analysis of polysome-associated RNA

(translated mRNA), total mRNA, translation and offsetting. A shift of the density towards low

p-values/FDRs indicates a higher frequency of changes.

(C) Enrichment of gene ontology annotation for biological processes among genes that

undergo significant changes in translation (light red – activated translation, dark red –

suppressed translation) in *TSC2*-Null vs WT NPCs. The ten most significant processes are

shown.

(D) Scatterplots from anota2seq analysis of *TSC2*-Null vs WT NPCs (top left and bottom right

panels) and *TSC1*-Null vs WT NPCs (top right and bottom left panels). Transcripts identified

as regulated by translation in anota2seq analysis in the *TSC2*-Null vs WT NPC (top left and

right panels) or *TSC1*-Null vs WT NPC (bottom left and right panels) comparisons are

indicated. Also shown are empirical cumulative distribution functions of the log2 fold changes

in translation for the corresponding gene sets. Grey dots and lines correspond to the

background (i.e. not in gene sets). Significant shifts of gene sets, relative to background, were

determined using Wilcoxon rank-sum test and the resulting p-values are shown.

(E) Venn diagram comparing translationally regulated genes identified in anota2seq analysis

following loss of *TSC1* or *TSC2*.

(F) Enrichments of gene ontology annotation for biological processes among genes identified

as showing consistent regulation in both *TSC1*-Null and *TSC2*-Null NPCs relative to their

controls (same color codes as in panel C).

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Figure 4. Suppressed translation of transcripts encoding ASD- and NDD-associated

proteins in *TSC2*-Null NPCs associates with distinct 5'UTR features.

(A) GSEA analysis of ASD- and NDD-associated genes using anota2seq analysis of

translation (fold-changes) contrasting *TSC2*-Null (-/-) vs WT NPCs. Rankings for ASD- and

NDD-associated genes (ASD72 and NDD373, respectively) were shifted towards the right

denoting suppressed translation. Normalized enrichment scores (NES) and adjusted p-values

are shown.

(B) Scatterplots from anota2seq analysis for *TSC2*-Null vs WT NPCs. High confidence ASD-

and NDD-associated genes (ASD72 and NDD373, respectively) (top left panel) as well as

eIF4E- (middle left panel) or mTOR-sensitive (bottom left panel) transcripts are indicated.

Shown to the right of each panel are corresponding empirical distribution functions together

with associated statistics (as in Figure 3D).

(C-D) Boxplots of 5'UTR lengths (C) and GC-contents (D) (according to the RefSeq database,

version 109.20201120) for ASD- and NDD-associated genes as well as mRNAs translationally

regulated in *TSC2*-Null vs WT NPCs (after excluding ASD- and NDD-associated genes;

background corresponds to mRNAs absent in all subsets). The mean length or GC-contents

for each set are indicated together with p-values from Wilcoxon rank-sum tests.

(E) The proportion of mRNAs harboring upstream open reading frames (uORFs) in their

5'UTRs among subsets of transcripts from C-D. The lower part of the bar graphs corresponds

to uORFs with a strong Kozak context. Differences in proportions of uORFs were assessed

using Fisher's exact tests for the indicated comparisons.

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Figure 5. mTORC1 or MNK1/2 inhibition reverses the TSC2-associated translatome.

(A and B) Scatterplots from anota2seq analysis of *TSC2*-Null (-/-) NPCs treated with RMC-

6272 vs DMSO (A, top left panel) or eFT-508 vs DMSO (B, top left panel). Sets of transcripts

whose translation was activated or suppressed under each treatment were then assess across

treatments (A and B, bottom panels). Also shown are empirical cumulative distribution

functions (A and B, right panels) of the log2 fold changes in translation for the corresponding

gene sets. Grey dots and lines correspond to the background (i.e. absent in gene sets).

Significant shifts of gene sets, relative to background, were determined using the Wilcoxon

rank-sum test and the resulting p-values are shown.

(C) Assessment of how transcripts whose translation was altered in *TSC2*-Null vs WT NPCs

(top panel, from Figure 3A) are modulated upon treatment with RMC-6272 (bottom left panel)

or eFT-508 (bottom right panel).

(D) Enrichments of gene ontology annotation for biological processes among genes identified

with reversed translation, relative to baseline (*TSC2*-Null vs WT NPCs) that overlap between

RMC-6272 and eFT-508 treatment (same color codes as in Figure 3C).

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Figure 6. mTORC1 or MNK1/2 inhibition reverses translation of transcripts encoding

ASD- and NDD-associated proteins in *TSC2*-Null NPCs.

(A) Scatterplots, showing high confidence ASD- and NDD-associated genes (ASD72 and

NDD373), from anota2seq analysis comparing *TSC2*-Null (-/-) vs WT NPCs (top panel) as well

as RMC-6272 (bottom left) or eFT-508 (bottom right) treated relative to DMSO treated *TSC2*-

Null NPCs are shown. The shape and position of ellipses correspond to the mean and

standard deviation, respectively, for all genes within each gene set.

(B) A Venn diagram of ASD associated genes (ASD72) whose translation was suppressed in

TSC2-Null NPC relative to *TSC2*-WT NPCs and reversed by treatment with RMC-6272 or

eFT-508.

(C) Plots denote RT-qPCR analysis from the polysome-associated RNA pool (3 biological

replicates) for 5 ASD- or NDD-associated genes (left) as well as 5 eIF4E-sensitive genes

(right) from the indicated cells and treatments. FC, fold change. Data were normalized to total

mRNA obtained in parallel as well as β-actin *(ACTB)* mRNA expression. P-values from

student's t-test test (*p<0.05, **p<0.01, ***p<0.001) for the indicated comparisons are shown.

Drug Tx[a]	Direction of regulation	Gene set name	# Genes	pV	Gene ID
DMSO	Down (baseline)	ASD72	31	1.72E-07	*MED13, NIPBL, ASH1L, KMT2A, CHD2, EHMT1, KMT5B, CHD8, WAC, RFX3, TLK2, SMARCC2, POGZ, KMT2C, ADNP, KCNB1, MEIS2, ASXL3, DYRK1A, SPAST, SETD5, VEZF1, AUTS2, NRXN1, TCF7L2, TAOK1, NF1, ZBTB20, MED23, KDM5B, DNMT3A*
RMC	Up	ASD72	28	1.78E-11	*MED13, NIPBL, ASH1L, KMT2A, CHD2, EHMT1, KMT5B, CHD8, WAC, RFX3, TLK2, POGZ, KMT2C, ADNP, MEIS2, ASXL3, DYRK1A, SPAST, SETD5, VEZF1, AUTS2, NRXN1, TCF7L2, TAOK1, NF1, MED23, KDM5B, DNMT3A*
eFT-508	Up	ASD72	18	8.63E-06	*MED13, NIPBL, ASH1L, KMT2A, CHD2, KMT5B, WAC, RFX3, KMT2C, MEIS2, ASXL3, SPAST, VEZF1, AUTS2, NRXN1, TCF7L2, TAOK1, NF1*
n/a	Down (baseline)	NDD373	138	2.59E-19	*MED13, NIPBL, SMC3, CNOT1, KMT2E, UBTF, KDM3B, TRRAP, USP7, ASH1L, KMT2A, CREBBP, KAT6A, SIN3A, CHD2, ARID1A, SPEN, EHMT1, TLE3, UBR5, CHD7, KMT5B, HIVEP2, CHD8, WAC, ZNF462, NSD1, ARID2, GATAD2B, FBXO11, TAB2, HDAC2, KMT2D, ZNF148, RFX3, TBL1XR1, ZEB2, SETBP1, PHIP, TLK2, RAI1, KIF5C, SMARCC2, SON, STAG1, POGZ, ZMYND11, KIF11, KMT2C, ADNP, KCNB1, COL4A1, KAT6B, SCN8A, ZMYND8, RFX7, PHF12, ZFHX3, SHOC2, TRIO, SOS1, ZNF292, ZFHX4, GNB1, SETD1B, TANC2, KIF2A, ARIH1, SOX9, ACVR2A, TNRC6B, SET, MEIS2, CTNND1, SMARCE1, GLI3, YY1, ASXL3, PDE4D, SETD2, SYNCRIP, BRAF, MAP3K7, DYRK1A, WDR48, TCF4, SRP54, SMAD4, SPAST, SETD5, HNRNPD, PIK3R1, SNAP25, FBXW7, VEZF1, SRSF1, KLF7, TOP2B, ZMIZ1, AUTS2, NRXN1, TRIM8, PPP2CA, CHAMP1, TCF7L2, TAOK1, ATF2, ZBTB10, NF1, SATB1, CSNK2A1, BICD2, CAPRIN1, ZBTB20, CDK13, ZMYM2, GABRB3, CBX5, TCF12, MAP2K1, MYCN, CDK8, SOX11, SYT1, TRPM3, RAC1, MSL2, ABCC9, MED23, DNM1L, KLHL20, TNPO3, KDM5B, KBTBD7, PPM1D, KRAS, DNMT3A, MIB1*
RMC	Up	NDD373	96	4.37E-18	*MED13, NIPBL, SMC3, CNOT1, KMT2E, UBTF, TRRAP, USP7, ASH1L, KMT2A, CREBBP, KAT6A, SIN3A, CHD2, EHMT1, TLE3, UBR5, CHD7, KMT5B, HIVEP2, CHD8, WAC, ZNF462, NSD1, ARID2, FBXO11, TAB2, KMT2D, ZNF148, RFX3, ZEB2, SETBP1, TLK2, RAI1, KIF5C, SON, STAG1, POGZ, ZMYND11, KIF11, KMT2C, ADNP, COL4A1, KAT6B, SCN8A, ZMYND8, PHF12, ZFHX3, SHOC2, TRIO, SOS1, ZNF292, SETD1B, TANC2, ARIH1, SOX9, ACVR2A, TNRC6B, MEIS2, CTNND1, YY1, ASXL3, PDE4D, SETD2, MAP3K7, DYRK1A, WDR48, SRP54, SPAST, SETD5, PIK3R1, SNAP25, VEZF1, KLF7, ZMIZ1, AUTS2, NRXN1, PPP2CA, CHAMP1, TCF7L2, TAOK1, ZBTB10, NF1, SATB1, CDK13, MAP2K1, MYCN, SYT1, TRPM3, MSL2, ABCC9, MED23, KLHL20, KDM5B, PPM1D, DNMT3A*
eFT-508	Up	NDD373	69	1.48E-10	*MED13, NIPBL, SMC3, KMT2E, ASH1L, KMT2A, KAT6A, SIN3A, CHD2, SPEN, UBR5, KMT5B, HIVEP2, WAC, ZNF462, ARID2, FBXO11, TAB2, KMT2D, ZNF148, RFX3, ZEB2, KIF5C, STAG1, ZMYND11, KIF11, KMT2C, KAT6B, SCN8A, RFX7, ZFHX3, SHOC2, TRIO, SOS1, ZNF292, TANC2, KIF2A, ARIH1, ACVR2A, MEIS2, ASXL3, PDE4D, SETD2, BRAF, MAP3K7, WDR48, SRP54, SPAST, PIK3R1, SNAP25, VEZF1, ZMIZ1, AUTS2, NRXN1, CHAMP1, TCF7L2, TAOK1, ATF2, ZBTB10, NF1, SATB1, CDK13, GABRB3, SYT1, ABCC9, DNM1L, KLHL20, TNPO3, MIB1*
n/a	Down (baseline)	EPI	22	5.82E-03	*KMT2E, DHX57, TTF1, KDM5B, TTI1, PCDH19, NCOA1, CDKAL1, KANSL1L, DYRK1A, CHD9, ORC2, FAM184A, TUT7, BIRC6, ALKBH8, SETD1B, ANK1, SLC6A16, BPTF, ZSCAN26, PMFBP1*
RMC	Up	EPI	19	6.97E-05	*KMT2E, DHX57, KDM5B, TTI1, PCDH19, NCOA1, KANSL1L, DYRK1A, CHD9, ORC2, FAM184A, TUT7, BIRC6, ALKBH8, SETD1B, SLC6A16, BPTF, ZSCAN26, PMFBP1*
eFT-508	Up	EPI	11	3.32E-02	*KMT2E, PCDH19, NCOA1, CHD9, FAM184A, TUT7, BIRC6, ALKBH8, SLC6A16, BPTF, PMFBP1*

Table 1. Gene set enrichment analysis of translationally downregulated genes in *TSC2*-Null NPCs related to ASD, NDD and epilepsy. [a]Drug Tx, treatment: DMSO, 10 nM RMC-6272 or 50 nM eFT-508; n/a, not applicable; pV, p-value; ASD72, 72 gene variants (false discovery rate (FDR)<0.001) identified in patients with autism spectrum disorder; NDD373, 373 gene variants (FDR<0.001) identified in patients with neurodevelopmental disorders [38]; EPI83, 83 gene variants identified in full epilepsy cohort [42].

Figure 1

A

B

TSC2-Corr-WT

TSC2-Het

TSC2-Null

C

D

Figure 2

Figure 3

Figure 4

Figure 5

Figure 6

A

B

28 RMC responsive
ASD72 genes

18 eFT responsive
ASD72 genes

ADNP, CHD8,
DNMT3A,
DYRK1A,
EHMT1, KDM5B,
MED23, POGZ,
SETD5, TLK2

ASH1L, ASXL3,
AUTS2, CHD2,
KMT2A, KMT2C,
SUV420H1, MED13,
MEIS2, NF1, NIPBL,
NRXN1, RFX3,
SPAST, TAOK1,
TCF7L2, VEZF1,
WAC

C