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Dysregulated coordination of *MAPT* exon 2 and exon 10 splicing underlies different tau pathologies in PSP and AD

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Abstract

Understanding regulation of *MAPT* splicing is important to the etiology of many nerurodegenerative diseases, including Alzheimer disease (AD) and progressive supranuclear palsy (PSP), in which different tau isoforms accumulate in pathologic inclusions. *MAPT*, the gene encoding the tau protein, undergoes complex alternative pre-mRNA splicing to generate six isoforms. Tauopathies can be categorized by the presence of tau aggregates containing either 3 (3R) or 4 (4R) microtubulebinding domain repeats (determined by inclusion/exclusion of exon 10), but the role of the N-terminal domain of the protein, determined by inclusion/exclusion of exons 2 and 3 has been less well studied. Using a correlational screen in human brain tissue, we observed coordination of *MAPT* exons 2 and 10 splicing. Expressions of exon 2 splicing regulators and subsequently exon 2 inclusion are differentially disrupted in PSP and AD brain, resulting in the accumulation of 1N4R isoforms in PSP and 0N isoforms in AD temporal cortex. Furthermore, we identified different N-terminal isoforms of tau present in neurofibrillary tangles, dystrophic neurites and tufted astrocytes, indicating a role for differential N-terminal splicing in the development of disparate tau neuropathologies. We conclude that N-terminal splicing and combinatorial regulation with exon 10 inclusion/exclusion is likely to be important to our understanding of tauopathies.

Keywords MAPT · Splicing · Progressive supranuclear palsy · Alzheimer's disease · Neuropathology · Isoforms

Introduction

Ninety-five percent of all human multi-exonic genes are subject to alternative pre-mRNA splicing [48, 60]. Correct regulation of this mechanism is essential for proteomic diversity by the production of multiple distinct isoforms from a single gene [46]. The microtubule-associated protein tau (*MAPT*)

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is a neuronally expressed gene consisting of 16 exons, many of which are differentially spliced within the central nervous system and peripheral tissues. Tau proteins are involved in axonal transport, synaptic plasticity, and stabilization of the microtubule network [26, 30, 44]. In the human brain, the splicing of *MAPT* exons 2, 3 and 10 results in the expression of six different isoforms, which can be parsed into two

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groups depending on their inclusion or exclusion of exon 10 (Fig. 1a).

The ratio of tau isoform expression changes during human brain development [25, 27] with only the shortest 0N3R isoform of tau being expressed in fetal brain [16, 25, 27, 45] Following birth, there is a sudden shift in the expression of both exons 2 and 10; exon 10 inclusion increases dramatically during the perinatal period [25] where it reaches a stable 3R:4R ratio of roughly 1:1 [3, 12, 59], whereas exon 2 expression increases gradually throughout the first decade of



Fig. 1 Splicing factor and RNA-binding protein expression is differentially correlated with the inclusion of *MAPT* exons 2 and 10. **a** *MAPT* exons 2, 3 and 10 are alternatively spliced, resulting in the expression of 6 different isoforms. At the N-terminus, exons 2 and 3 may be included or excluded, although exon 3 inclusion requires the inclusion of exon 2. The absence of either exon results in 0N isoforms, exon 2 alone results in 1N isoforms, and exon 3 inclusion defines 2N isoforms. At the C-terminus, the inclusion of exon 10 (encoding the second microtubule-binding repeat domain) defines 4R isoforms, whereas its exclusion results in 3R isoforms. **b** *MAPT* exon expression (RPKM) in the AMP-AD ROSMAP cohort. Error bars \pm SEM. **c** *MAPT* exons 2, 3 and 10 percent spliced in (PSI)

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across four Brodmann regions examined in the AMP-AD MSBB cohort. Error bars \pm SEM. **d** PSI values for *MAPT* exons 2, 3 and 10 in cerebellum and temporal cortex in the AMP-AD MAYO cohort. Error bars \pm SEM. **e**-**f** *MAPT* PSI values for exons 2, 3 and 10 between 17q21.31 H1 and H2 haplotypes in **e** MSBB and **f** MAYO AMP-AD datasets. Error bars \pm SEM. **g** Pearson's correlation coefficients with unsupervised hierarchical clustering between SF/RBP expression (*x*-axis) and *MAPT* exon 2/exon 10 PSI values in ROS-MAP and MSBB data. Blue indicates a positive correlation ("includers") and red indicates a negative correlation ("excluders"), while yellow denotes no association. All comparisons carried out using linear regression model. ***p < 0.001

life [25]. The reason for this shift and the function of different *MAPT* isoforms is not fully understood. However, 4R tau has an increased affinity for binding microtubules that results in their increased stabilization [21]; therefore, shorter 3R isoforms may allow for greater neuroplasticity during brain development. It has been proposed that different N-terminal isoforms may also contribute to microtubule stabilization [14], and that the inclusion of exons 2 and 3 results in the extension of the acidic region of tau, lengthening its projection domain [9], which in turn may increase the distance between microtubules and increase bundling [33].

Understanding MAPT splicing is of critical importance to the etiology of tauopathies, which are characterized by the presence of neuronal and/or astroglial tau aggregates. Primary tauopathies include frontotemporal dementia (FTD), progressive supranuclear palsy (PSP), corticobasal degeneration (CBD), primary age-related tauopathy (PART) and Pick's disease (PiD), while other tauopathies, such as AD, are secondary to amyloid-beta (AB) deposition. In several primary tauopathies, the regulation of MAPT splicing is altered and mis-spliced isoforms are differentially incorporated into neurofibrillary tangles (NFTs) and pathogenic inclusions [13, 15]. The most striking evidence in support of the importance of regulated splicing is the numerous synonymous and intronic MAPT mutations, such as S305S [53, 55], IVS10+16 [28] and N296N [54], which result in increased exon 10 inclusion, and the subsequent development of autosomal dominant FTD. The ability for these mutations to induce tau pathology in the absence of an altered amino acid sequence is indicative of the relevance of MAPT splicing to disease pathogenesis, and the importance of maintaining the correct tau isoform ratio.

Alternative splicing of MAPT exon 10 in both healthy and diseased brain has been well characterized, although studies examining exon 10 expression in AD have yielded inconsistent results [3, 12, 19, 20, 29, 62]. In contrast, less is known about the regulation of exons 2 and 3, and there have been no studies directly assessing the contribution of N-terminal tau isoforms to primary tauopathies. To date, splicing of exon 10 has been associated with the function of several candidate splicing factors (SFs) and RNA-binding proteins (RBPs), the most comprehensively investigated of which are the serine and arginine-rich family of splicing factors (SRSFs). Multiple SRSFs have been associated with both exon 10 inclusion and exclusion [28–31], as have Tra2 β [6, 13, 31, 57], FUS [57], RBM4 [34], NOVA1 [61] and hnRNPs E2 and E3 [5, 61]. However, there is limited evidence for many of these associations, and their impact on MAPT splicing lacks robust replication.

Here, we report a correlational screen for SFs/RBPs in human brain tissues that revealed novel genes associated with *MAPT* splicing, and uncovered coordinated regulation of *MAPT* exons 2 and 10. We found that the splicing factor RSRC1 bound directly to MAPT pre-mRNA and was associated with both exon 10 exclusion and exon 2 inclusion. Furthermore, RSRC1 was also differentially expressed in PSP and AD brain, suggesting a regulatory role for this SF in disease pathogenesis. Consistent with discordant RSRC1 expression, we observed increased expression of exon 2 and exon 10-containing transcripts in PSP brain, and increased expression of 0N transcripts in AD brain, which correlate with the accumulation of different N-terminal tau isoforms in different neuropathological features of AD and PSP. We therefore conclude that differential expression of MAPT splicing regulators in AD and PSP brain results in the loss of coordination between MAPT exon 10 and exon 2 splicing. In turn, this results in the expression and accumulation of different N-terminal isoforms in each disease, which may underlie the development of different neuropathological features characteristic of AD and PSP.

Methods

RNA-seq data analysis

Aligned BAM files and gene expression count data were downloaded from the AMP-AD consortium through Synapse (https://adknowledgeportal.synapse.org/). MAPT exon level counts were calculated using the FeatureCounts feature within the Subread package [39, 40], and percent spliced in (PSI) values were determined using the Mixture of Isoforms (MISO) package [35]. For statistical analysis, associations between MAPT PSI values and the expression of SFs/RBPs were carried out using a linear model in R with RNA integrity number (RIN), postmortem interval (PMI), sex, and age at death included in the model as covariates. The resulting *p*-values were Bonferroni-corrected for the number of comparisons. For heatmap plotting, correlation coefficients were generated using Pearson's correlation as part of the cor function in R. For the comparison of SF/RBP expression in PSP and AD brain, the fold change expression of each SF/RBP in disease brain was calculated in comparison to controls and plotted in R using ComplexHeatmap [23], and statistically significant differences were determined by linear regression of expression values including the previously described covariates.

At the time of analysis, genotype data were unavailable for the MSBB cohort, so 17q21.31 haplotype was determined by Taqman genotyping. The relevant DNA was obtained from the NIH Neurobiobank. Taqman genotyping was carried out for H2 tag SNPs rs8070723 and rs1052553 using commercially available assays. Haplotypes were determined for the other cohorts using the same tag SNPs from genotype data downloaded from the AMP-AD knowledge portal (https://adknowledgeportal.synapse.org/).

Single-nuclei and single-soma sequencing analysis

Snuc-seq processed gene counts and covariates derived from AD and control entorhinal cortex [22] were downloaded from the Gene Expression Omnibus (GEO) (GSE138852). Data were further normalized and analyzed in Seurat 3.0 dev [7, 58]. Data from different individuals were integrated and scaled using SCTransform [24] while regressing out the percentage of mitochondrial genes, the number of genes per cell and the number of reads per cell. Principal components analysis (PCA) was carried out in Seurat using the top 3000 most variable genes, and data was reduced using UMAP [43]. Cell types present within each cluster were already annotated in the downloaded metadata. Differential gene expression analysis was carried out between AD cases and controls across the whole data set, or within the neuronal cluster only, using the MAST model applied to log normalized raw count data, including the percent of mitochondrial genes as a covariate.

Aligned HDF5 feature barcode matrices for the single-soma sequencing data of AT8-positive and -negative neurons from AD PFC [47] were downloaded from GEO (GSE129308) and processed in Seurat [7, 58]. Data were filtered for cells expressing > 200 genes, < 2500 reads and < 10% mitochondrial genes. Data were integrated, transformed and reduced as described above. Differential gene expression analysis was carried out between AT8-positive and AT8-negative cells across the whole data set, using the MAST model applied to log normalized raw count data, including the percent of mitochondrial genes, age, RNA integrity number (RIN) and postmortem interval (PMI) as covariates.

Aligned HDF5 feature barcode matrices for PSP snucseq data [52] were kindly shared by Drs. Pereira and Crary, and were filtered, integrated, transformed and reduced in the same manner as the AD snuc-seq and AT8 soma-seq data described above. Individual clusters were identified in Seurat using the default resolution factor 0.5. Cell types within each cluster were defined using visualization of specific markers utilized in the AD snuc-seq data [22]; CD74 (microglia), AQP4 (astrocytes), MEGF11 (oligodendrocyte precursor cells (OPCs)), MOBP (oligodendrocytes), SYT1 (neurons) and FLT1 (endothelial cells). Differential gene expression analysis was carried out between PSP cases and controls across the whole data set, or within the neuronal cluster only, using the MAST model applied to log normalized raw count data, including the percent of mitochondrial genes and age as covariates.

Human brain tissue

Fresh frozen human control, AD and PSP temporal cortices were acquired from the Mount Sinai Neuropathology Core brain bank and the Harvard Brain Tissue Resource Center, University of Maryland Brain and Tissue Bank and Mount Sinai Brain Bank via the NIH Neurobiobank. Formalinfixed paraffin-embedded sections from temporal cortex were acquired from the Mount Sinai Neuropathology Core brain bank, with neuropathological diagnosis being determined by Dr. John Crary. All post-mortem tissues were collected in accordance with the relevant guidelines and regulations of the respective institutions. A summary of tissues used in this project are described in Supplementary Table 1 (online resource).

Cell culture

All cell culture reagents were purchased from Thermo Fisher Scientific, unless otherwise stated. SH-SY5Y cells were grown in IMDM media supplemented with 1% penicillin/ streptomycin and 10% FBS, and grown and maintained at 37 °C with 5% CO₂ in a humid environment. Prior to transfection, cells were seeded into 6-well plates at a density of 1.6×10^5 cells per well. The next day, cells were transfected with 1.25 µg of LI9LI10 mini-gene and 1.25 µg of plasmid DNA of the SF/RBP of interest (all Origene) using Lipofectamine 3000. Cells were collected for RNA extraction and analysis 48 h later. For N-terminal antibody validation, N2a cells were transfected with 2.5 µg of either a 0N3R, 1N3R or 2N3R MAPT cDNA vector (Origene), and after 48 h were either fixed with 10% formalin (Sigma Aldrich) for 15 min at room temperature for immunofluorescence, or pelleted in PBS for protein extraction and western blotting.

RNA pull-down

The LI9LI10 mini-gene was digested by NotI (Cell Signaling Technologies) and SgfI (Promega) to excise the MAPT coding sequence and upstream T7 promoter from the PCI-Neo backbone. The resulting DNA was transcribed in vitro using the T7 Megascript kit (ThermoFisher Scientific), incubated at 37 °C for 4 h, followed by 15 min treatment with DNase to degrade any remaining DNA template. The resulting RNA was isolated by Lithium Chloride precipitation, and examined on a 1% agarose gel for the anticipated product size, compared against Lambda DNA digested with HindIII and EcoRI (both Cell Signaling Technologies). RNA was labelled using the 3' end desthiobiotinylation RNA labelling kit (ThermoFisher), with 150 µg/25 nM RNA per reaction incubated at 16 °C overnight. Labelled RNA was then isolated by chloroform and ethanol precipitation. A negative control consisting of a scrambled RNA sequence was

labelled at the same time. Labelling efficiency was measured by comparison of chemiluminescent signal from labelled sample RNA with a positive control using the ThermoFisher Scientific Chemiluminescent Nucleic Acid detection module. 25 nM of labelled RNA was then bound to nucleic acidcompatible streptavidin magnetic beads using the Pierce Magnetic RNA–Protein Pull-down kit (ThermoFisher Scientific) and incubated with 100ug protein lysate from human brain overnight at 4 °C. Bound protein was eluted from the beads and immediately subject to western blot analysis for SFs/RBPs of interest.

SDS-PAGE gel electrophoresis and western blot

Soluble protein was collected from cell pellets and human brain tissue by resuspension in Cell Lysis Buffer (Cell Signaling Technologies) supplemented with 10 μ M PMSF on ice. Cells or tissue were then sonicated briefly on ice and spun at 13,000×g for 10 min at 4 °C to pellet debris. Protein concentration was determined by BCA assay (ThermoFisher Scientific). Prior to western blotting, human brain protein lysates were dephosphorylated to accurately determine Tau isoforms by size. Lysates were incubated with 100 units of Lambda protein phosphatase (LPP; Cell Signaling Technologies) per 10 µg total protein, supplemented with 1×Protein MetalloPhosphatases buffer and 1 mM MnCl₂, and incubated at 30 °C for 3 h before being analyzed by western blot.

For SDS-PAGE gel electrophoresis, 10-30 µg of protein was incubated with 1×reducing agent and 1×LDS sample buffer at 70 °C for 10 min before immediately being loaded onto a BOLT 4-16% Bis-Tris gel (ThermoFisher Scientific) in $1 \times MES$ buffer. For splicing factor analyses, electrophoresis was carried out for 20 min at 200 V before blotting. For tau isoform analyses, electrophoresis was carried out for 60 min at 100 V before blotting. Gels were blotted onto nitrocellulose membranes using the iBlot system (ThermoFisher Scientific), and blocked for a minimum of 30 min in 5% milk in PBS-T. Primary antibodies were prepared at dilutions described in Supplementary Table 2 (online resource) in 5% milk in PBS-T and incubated with the membrane at 4 °C overnight. Membranes were washed 3 × in PBS-T, then incubated with either HRP Goat Anti-Rabbit or HRP Horse Anti-Mouse secondary antibodies (Vector laboratories) at a dilution of 1:20,000 in 5% milk in PBS-T for 2 h at room temperature. Following three additional washes, membranes were then incubated with WesternBright ECL HRP substrate (Advansta) for 3 min before imaging on a UVP ChemiDoc. For re-staining, blots were incubated in Restore PLUS stripping buffer (ThermoFisher Scientific) for 15 min at room temperature, followed by one wash in PBS and re-blocking.

qRTPCR

Cell pellets were collected by washing and scraping into ice-cold PBS. RNA was extracted from cell pellets using the Qiagen RNeasy mini RNA extraction kit, and reverse-transcribed using the high-capacity RNA-to-cDNA kit (ThermoFisher Scientific). qRTPCR for specific MAPT exons and isoforms was carried out using SybrGreen mastermix with the following primers: MAPT 4R Forward 5'-CGGGAA GGTGCAGATAATTAA-3', Reverse 5'-GCCACCTCC TGGTTTATGATG-3': MAPT 3R Forward 5'-AGGCGG GAAGGTGCAAATA-3', Reverse 5'-GCCACCTCCTGG TTTATGATG-3'; MAPT ON Forward 5'-TTTGAACCA GGATGGCTGAG-3', Reverse 5'-ATGCCTGCTTCTTCA GCTTT-3'; MAPT Exon 2 Forward 5'-TTTGAACCAGGA TGGCTGAG-3', Reverse 5'-CTGCAGGGGAGATTCTTT CA-3'. SF/RBP overexpression was validated and quantified by qRTPCR using commercially available Taqman assays (ThermoFisher Scientific).

MAPT targeted iso-seq

RNA was extracted from human temporal cortex brain tissue as described above and submitted to the Icahn School of Medicine at Mount Sinai Genomics CoRE for single molecule real-time (SMRT) isoform sequencing (iso-seq) on the PacBio RS II platform using the following primers: Forward 5'-ATG GAA GAT CAC GCT GGG AC-3', Reverse 5'-GAG GCA GAC ACC TCG TCA G-3'. Raw sequencing reads were passed through the ISOseq3 pipeline to detect fulllength transcripts expressed in each sample. Beginning with raw subreads, single consensus sequences were generated for each MAPT amplicon with a SMRT adapter on both ends of the molecule. SMRT adapter sequences were then removed and MAPT-specific primer sequences were identified to orient the isoforms. Isoforms were subsequently trimmed of poly(A) tails and concatemers were identified and removed. Isoform consensus sequences were then predicted using a hierarchical alignment and iterative cluster merging algorithm to align incomplete reads to longer sequences. Finally, clustered isoform sequences were polished using the arrow model and binned into groups of isoforms with predicted accuracy of either ≥ 0.99 (high quality) or < 0.99(low quality). The resulting isoforms were aligned to hg38 using the GMAP aligner [63] and isoform calling, collapsing and measurements of abundance were carried out using the Cupcake/ToFU pipeline (https://www.github/Magdoll/ cDNA Cupcake).

Immunohistochemistry

Immunohistochemical staining was carried out on formalin fixed paraffin-embedded brain sections by the Neuropathology Brain Bank and Research CoRE at the Icahn School of Medicine at Mount Sinai using the Ventana BenchMark autostainer. Slides were scanned on a Leica SCN400 at 40×. A list of antibodies used and their relevant dilutions can be found in Supplementary Table 2 (online resource).

OPAL multiplexed immunofluorescence

Multiplexed immunofluorescent staining was carried out using the Opal Polaris 7 color IHC detection kit (Akoya biosciences) according to manufacturer's instructions. Briefly, slides were baked for 1 h at 65 °C, then deparaffinized with xylene and rehydrated with a graded series of ethanol concentrations. For epitope retrieval, slides were microwaved in AR buffer (provided with the OPAL IHC detection kit) for 45 s at 100% power, followed by an additional 15 min at 20% power. After cooling, slides were blocked for 10 min in blocking buffer then incubated with the first primary antibody at room temperature for 30 min. Slides were rinsed three times in TBS-T, then incubated with the secondary polymer HRP for 1 h at room temperature. After additional washes, the first Opal fluorophore was incubated with the slides for 10 min at room temperature, followed by further washes in TBS-T. This process was repeated from the microwave treatment step for each additional primary antibody, followed by one final repetition of the microwave treatment to strip the primary-secondary antibody complex from the tissue. Antibodies, concentrations and relevant Opal fluorophores can be found in Supplementary Table 2 (online resource). Once all primary antibodies had been introduced, slides were counterstained with DAPI for 5 min at room temperature, washed with TBS-T and coverslips were mounted using ProLong Diamond Antifade mounting reagent (ThermoFisher Scientific). Multispectral imaging was carried out using the Vectra Quantitative Pathology Imaging system, applying quantitative unmixing of fluorophores and removal of tissue autofluorescence. Images were visualized using the HALO image analysis platform (Indica Labs).

Statistical analysis

RNA-seq count and PSI data were analyzed as described above. Enrichment of SFs/RBPs in specific clusters was determined by Fisher's exact test in R. Western blot protein bands were quantified by densitometry analysis in ImageJ and normalized to GAPDH for each sample, and the resulting values were subjected to unpaired Student's *t* test. For tau isoform analysis, ratios between each isoform were calculated per sample prior to statistical analysis. For assessment of RNA pull-downs, the amount of eluted SF/ RBP protein was normalized to the total amount of SF/RBP protein (Flow-through + Eluate) to determine the percentage of SF/RBP protein bound to the labelled RNA, and this value was used for statistical analysis by Student's t test. For isoseq data, the expression of each isoform was calculated as a proportion of all detected isoforms, and average expression between control, AD and PSP cases was calculated. Statistical difference in isoform expression and expression ratios were calculated by one-way ANOVA with Tukey post hoc testing. qRTPCR gene expression was analyzed using the $\Delta\Delta$ Ct method, and expression was normalized to β -actin as endogenous control. Statistical significance was determined by the appropriate one-way ANOVA and Bonferroni post hoc testing. For cell culture experiments, all tests were conducted in triplicate in three independent experiments (total replicates = 9). For human brain analyses, tissue was acquired for 4-6 PSP cases, 4-6 AD cases and 4-6 healthy aged controls. Significant comparisons are labelled in figures as **p* < 0.05, ***p* < 0.01 and ****p* < 0.001.

Results

MAPT alternative splicing differs by brain region and 17q21.31 haplotype

MAPT is alternatively spliced at exons 2, 3 and 10 in the human brain (Fig. 1a), and expression of these exons across brain regions has previously been measured by microarray analyses [59]. However, accurate measurement of gene or exon expression by microarray may be impacted by the specificity of probe design and a narrow dynamic range for signal detection. We therefore chose to characterize the relative expression of MAPT exons in multiple human postmortem RNA-seq datasets from the AMP-AD consortium (Religious Orders Study Memory and Aging Project [ROS-MAP; Synapse syn3219045] N=450, Mount Sinai Brain Bank [MSBB; Synapse syn3159438] N=230, and the Mayo Clinic [MAYO; Synapse syn3157268, syn5550404] *N*=276) (Fig. 1b-f, Supplementary Fig. 1A-H (online resource)). We observed a pattern of exon expression consistent with that previously described [8, 59] and known isoforms expressed in brain (i.e., constitutive expression of exons 1, 4, 5, 7, 9, 11 and 12, little to no expression of exons 4a, 6 and 8, and variable levels of exon 2, 3 and 10), which was consistent across AMP-AD datasets and brain regions (Fig. 1b, Supplementary Fig. 1A-C (online resource)).

To assess proportional exon expression across different brain regions included in MSBB and MAYO data, we calculated percent spliced in (PSI) values for the alternatively spliced exons 2, 3 and 10 using MISO (Mixture of Isoforms) (Fig. 1c, d). While there were no differences in PSI values across MSBB Brodmann regions BM10 (frontal pole), BM22 (superior temporal gyrus), BM36 (fusiform gyrus) and BM44 (inferior frontal gyrus; Fig. 1c), there was significantly increased inclusion of all three exons in cerebellum compared to the temporal cortex in the MAYO cohort (Exon 2 $p = 5.46 \times 10^{-16}$; Exon 3 $p = 2.74 \times 10^{-8}$; Exon 10 $p = 1.54 \times 10^{-9}$; Fig. 1d). This is consistent with previous reports that suggest *MAPT* splicing in the cerebellum differs from the forebrain [3, 59].

We then compared PSI values between the major 17q21.31 *MAPT* H1 and H2 haplotypes, and observed increased exon 3 inclusion in H2 haplotype carriers compared to H1 across most AMP-AD datasets and brain regions (MSBB H1H2 $p = 1.14 \times 10^{-09}$, MSBB H2H2 $p = 1.09 \times 10^{-13}$; MAYO H1H2 $p < 2 \times 10^{-16}$, MAYO H2H2 $p = 1.9 \times 10^{-04}$, Fig. 1e, f, Supplementary Fig. 1D-E (online resource)), which has been previously reported in other RNA-seq and microarray datasets [2, 38, 59]. In comparison, we did not observe any difference in exon 2 or 10 inclusion between haplotypes (Fig. 1e, f, Supplementary Fig. 1D-E (online resource)). In contrast to previous reports [32], we did not find altered total *MAPT* expression between these haplotypes in any dataset or brain region (Supplementary Fig. 1F-H (online resource)).

MAPT exon 2 and 10 splicing is coordinated by SF/ RBP expression

To identify novel MAPT splicing regulators in human prefrontal cortex, we carried out a correlational analysis between the expression (RPKM) of 294 known splicing factors (SFs) and RNA-binding proteins (RBP) described in Gerstberger et al. [18] (Supplementary Table 3 (online resource)) with MAPT exon 2, 3 and 10 PSI values, using ROSMAP and MSBB datasets (Fig. 1g, Supplementary Fig. 2A-G (online resource)). We did not observe any significant correlations that withstood Bonferroni multiple test correction between MAPT exon 3 and any SF/RBP (Supplementary Fig. 2A (online resource)), likely due to the very low expression of exon 3 in human brain. However, when we separated the data by H1/H2 haplotype, we observed stronger associations between exon 3 inclusion and SF/RBP expression in H2 homozygotes compared to H1 homozygotes in both datasets (Supplementary Fig. 2B-C (online resource)), although these still did not pass multiple test correction due to low frequency of the H2 haplotype in these datasets. While we did not have the statistical power to pursue analysis of exon 3 splicing regulators, these data indicate there may be additional regulation of exon 3 in the context of H2, consistent with its increased expression on this background.

In contrast, there were no significant differences in SF/ RBP and *MAPT* exon 2/10 PSI value associations between H1/H2 haplotypes, which were highly correlated across both haplotypes (ROSMAP exon 2 R^2 =0.81, p < 0.001, exon 10 R^2 =0.89, p < 0.001; MSBB exon 2 R^2 =0.67 p < 0.001, exon 10 R^2 =0.66 p < 0.001) (Supplementary Fig. 2D-E (online resource)). Associations between PSI values and SF/RBP expression were also significantly correlated between AD cases and controls (ROSMAP exon 2 R^2 =0.97 p < 2.2 × 10⁻¹⁶, exon 10 R^2 =0.96 p < 2.2 × 10⁻¹⁶; MSBB exon 2 R^2 =0.89 p < 2.2 × 10⁻¹⁶, exon 10 R^2 =0.93 p < 2.2 × 10⁻¹⁶) (Supplementary Fig. 2F-G (online resource)), indicating no differences in the regulatory effects of SF/RBP expression on *MAPT* splicing in AD. We therefore focused our analyses on exons 2 and 10 using pooled AD/control and H1/H2 data.

Unsupervised hierarchical clustering of the resulting Pearson's correlation coefficients between exon PSI values and SF/RBP expression revealed that exons 2 and 10 clustered separately from each other and had distinct patterns of association with SF/RBP expression (Fig. 1g). To identify robust MAPT splicing regulator candidates, we selected SF/ RBPs with significant (Bonferroni-corrected p-value < 0.05) associations with MAPT exons 2 or 10 across the three most anatomically similar datasets; ROSMAP (prefrontal cortex), MSBB BM10 (frontal pole) and MSBB BM44 (inferior frontal gyrus). Many more SFs/RBPs were consistently associated with exon 10 exclusion (94 genes, 69.1% of all significant and replicated correlations, defined by a negative correlation; Supplementary Table 4 (online resource)) compared with its inclusion (5 genes replicated in 2/3 datasets, [3.7%], defined by a positive correlation; Supplementary Table 4 (online resource)), suggesting that more complex regulation may be required to promote removal of exon 10 from pre-mRNA transcripts in brain.

Fewer SFs/RBPs were consistently associated with exon 2 splicing (7 [5.1%] excluders, 16 [11.8%] includers). However, a proportion of SFs/RBPs were significantly associated with both exon 2 and exon 10 PSI values in opposing directions (Table 1). Specifically, 14 SF/RBPs (10.3%) were significantly correlated with both exon 10 exclusion and exon 2 inclusion, suggesting a coordinated regulation of *MAPT* N- and C-terminal splicing that has not been previously characterized. We therefore chose to focus on this subset of genes (Table 1).

RSRC1 and RBM11 directly bind *MAPT* pre-mRNA and alter *MAPT* splicing in vitro

To prioritize SFs/RBPs for validation, we identified genes known to be expressed in brain (queried through the GTex portal; www.gtexportal.org) and neurons (Barres RNAseq browser; www.brainrnaseq.org), as we predicted these would be most relevant to the regulation of *MAPT*, which

Table 1 MAPT exon 10 excluders and exon 2 includers replicated across ROSMAP and MSBB datasets

Gene name	Exon 10 exclusion						Exon 2 inclusion					
	ROSMAP PFC		MSBB BM10		MSBB BM44		ROSMAP		MSBB BM10		MSBB BM44	
	Rank	Bonferroni	Rank	Bonferroni	Rank	Bonferroni	Rank	Bonferroni	Rank	Bonferroni	Rank	Bonferroni
CPSF3	18	7.04E-30	23	3.38E-09	38	5.62E-14	104	2.14E-12	51	0.00439307	31	1.77E-06
LSM4	16	2.63E-31	38	9.97E-09	20	9.70E-16	3	2.02E-32	47	0.00259308	47	0.000357
POLR2K	11	3.12E-32	46	3.09E-08	29	5.11E-15	48	2.61E-21	30	3.36E-05	26	6.61E-07
PPIE	32	1.44E-25	6	3.90E-12	62	5.60E-12	43	4.05E-22	56	0.01030525	32	6.43E-06
PPIH	6	3.72E-35	8	1.96E-11	4	3.60E-17	27	4.44E-25	37	0.00023555	11	3.92E-09
PUF60	19	8.33E-30	31	7.04E-09	109	2.03E-08	53	1.21E-20	26	2.43E-05	66	3.98E-07
RBM11	24	1.12E-27	18	1.58E-09	36	3.28E-14	31	7.10E-24	13	1.35E-06	2	6.00E-11
RSRC1	9	1.10E-34	88	1.20E-05	42	2.61E-13	90	7.51E-15	52	0.00769628	42	0.000152
RTCB	91	5.42E-15	51	7.76E-08	24	3.06E-15	39	1.57E-22	42	0.00057674	18	1.11E-07
SNRNP25	34	2.92E-25	76	1.91E-06	22	1.87E-15	18	2.97E-27	44	0.00090501	35	1.04E-05
SNRPB	1	8.15E-45	1	1.43E-15	2	4.93E-20	37	3.59E-23	9	4.69E-07	6	1.08E-09
ТНОС3	53	1.68E-21	41	1.38E-08	41	1.80E-13	18	7.79E-27	23	1.44E-05	3	4.94E-10
THOC7	29	1.93E-26	72	8.51E-07	18	9.29E-16	5	1.93E-31	63	0.04167339	34	9.28E-06
TXNL4A	41	9.62E-24	69	6.84E-07	10	8.71E-17	15	1.75E-27	55	0.00992996	33	8.57E-06

is primarily neuronally expressed. This resulted in a panel of seven exon 2 includers/exon 10 excluders (Table 1, bold text).

To validate the association of candidate SF/RBPs with MAPT splicing, we first assessed whether they were able to directly interact with MAPT pre-mRNA in the context of human brain tissue. We carried out RNA pull-downs using desthiobiotinylated in vitro reverse-transcribed RNA generated from a mini-gene containing MAPT exons 9-11, with full intervening intronic sequences (LI9LI10) [64] and probed protein lysates derived from postmortem human prefrontal cortical tissue. The resulting eluates were examined by western blot for SFs/RBPs of interest. LI9LI10-derived MAPT pre-mRNA pulled down significant proportions of RSRC1 (41.62%, *p* < 0.001) and RBM11 (11.11%, *p* < 0.01) proteins from human brain lysates (Fig. 2a, b), as well as a minimal, but not significant proportion of THOC3 (5.77%) and SNRNP25 (4.77%), suggesting that these factors may regulate MAPT exon 10 splicing via a direct interaction with its pre-mRNA.

To functionally validate whether *RSRC1* and *RBM11* could alter *MAPT* splicing in vitro, we overexpressed these SF/RBPs in human neuroblastoma SH-SY5Y cells as an immortalized cell line proxy to neuronal cells (Supplementary Fig. 3A-B (online resource)). As expression of *MAPT* exon 10 was very low in this cell line, we co-expressed the LI9L10 minigene with each SF/RBP to facilitate measurement of exon 10 exclusion. Consistent with their putative roles as exon 10 excluders, overexpression of either *RBM11* or *RSRC1* significantly reduced the 4R:3R ratio, as measured by qRTPCR (*RBM11 p* < 0.001, *RSRC1 p* < 0.01) (Fig. 2c).

While PPIH and SNRPB did not directly bind MAPT premRNA, their overexpression resulted in a significantly reduced 4R:3R ratio in SH-SY5Y cells (SNRPB p < 0.01, *PPIH p < 0.001*) (Supplementary Fig. 3C (online resource)). There was no significant effect of THOC7, THOC3 or SNRNP25 (Supplementary Fig. 3C (online resource)), possibly due to poor overexpression efficiency. We then measured the ability for candidate SF/RBPs to alter N-terminal splicing of endogenous MAPT, and found that both RBM11 and RSRC1 overexpression significantly increased the Exon 2/0N ratio in SH-SY5Y cells (*RBM11* p < 0.001, *RSRC1* p < 0.01) (Fig. 2C), consistent with their hypothesized role as exon 2 includers. In contrast, we did not see any effect of other candidate SF/RBPs on exon 2 inclusion (Supplementary Fig. 3D (online resource)). We therefore conclude that RBM11 and RSRC1 may be important regulators of combinatorial N- and C-terminal MAPT splicing.

Regulators of *MAPT* N-terminal splicing and *MAPT* exon 2 are differentially expressed in PSP and AD brain

Altered *MAPT* C-terminal splicing is a characteristic of several tauopathies [15], including PSP¹⁹ and AD, for which there is inconsistent data [3, 12, 19, 20, 29, 62]. We therefore queried the AMP-AD MAYO temporal cortex RNA-seq dataset, which includes both AD and PSP cases, to investigate whether *MAPT* splicing regulation may be altered in tauopathy brain. We calculated the fold change (FC) expression of every significant SF/RBP from our initial correlational analysis (Supplementary Table 4



Fig. 2 RBM11 and RSRC1 directly bind to *MAPT* pre-mRNA and regulate splicing. **a** *MAPT* pre-mRNA pull-downs from human brain tissue protein lysates for each target SF/RBP using the LI9L110 minigene sequence or scrambled (Scr) RNA sequence as bait. *FT*, flow through fraction not bound to *MAPT* pre-mRNA or non-specific control; *E*, eluate fraction bound to target RNA. **b** Quantification of RNA pull-down western blots in **a**. Fraction of protein pulled down in *E* normalized to total protein present in *FT* and *E* fractions combined. *N*=3, each SF/RBP compared to scrambled control using *t*

(online resource)) in PSP and AD compared to controls (Fig. 3a). While PSP and AD shared largely similar patterns of SF/RBP expression dysregulation compared to controls, there were many genes that exhibited differential patterns of expression in either disease (Fig. 3a). The group of SFs/RBPs that exhibited increased expression in PSP and reduced expression in AD comprised 4/7 of our candidate SF/RBPs, including both RBM11 and RSRC1, which were associated with both exon 2 inclusion and exon 10 exclusion. In contrast, SFs/RBPs that were increased in AD and reduced in expression in PSP were significantly enriched for exon 2 excluders (Fisher's exact test p = 0.0005) (Fig. 3a). Furthermore, the net fold change (FC) expression of all exon 2 includers was significantly higher in PSP temporal cortex compared to AD (PSP average FC = 0.024, AD average FC = -0.036, p < 0.01) (Fig. 3b), suggesting differential regulation of MAPT exon 2 splicing between diseases. To confirm this hypothesis,

test. **p < 0.01, ***p < 0.001, *ns* not significant. **c** Fold change (FC) expression of 4R:3R and Ex2:0N ratios in SH-SY5Y cells by qRT-PCR following overexpression of either *RBM11* or *RSRC1*. Asterisks denote significantly different expression compared to empty vector control, represented by grey line intersecting plot at FC=1. One-way ANOVA and post-hoc Bonferroni tests for multiple comparisons. N=3 independent experiments with 3 replicates each. **p < 0.01, ***p < 0.001

we compared *MAPT* exon 2, 3 and 10 PSI values in control, PSP and AD brain from the same dataset (Fig. 3d–f). Consistent with the observed patterns of exon 2 splicing regulator expression in PSP and AD, we observed significantly different exon 2 inclusion across cases compared to controls ($F_{(2,134)} = 4.01$, p = 0.02), with significantly increased exon 2 PSI in PSP brain compared to controls (Tukey HSD p = 0.02), and a trend towards reduced exon 2 PSI in AD brain compared to controls (Fig. 3d). In contrast, there was no significant difference in exon 3 or exon 10 PSI values between either disease and controls (Fig. 3e, f). Taken together, this suggests there is differential dysregulation of *MAPT* N-terminal splicing regulators between AD and PSP brain, which results in altered expression of *MAPT* exon 2.



Fig. 3 *MAPT* exon 2 expression and regulation is differentially altered in PSP and AD brain. **a** Fold change expression of each significant SF/RBP from the analysis in Fig. 1g in PSP and AD brain compared to controls (AMP-AD MAYO temporal cortex), with unsupervised hierarchical clustering. Red indicates increased expression compared to controls, blue indicates reduced expression compared to controls. The direction of association of each SF/RBP with *MAPT* exon 2 and exon 10 splicing is indicated to the right of the figure. Clusters containing target SF/RBPs of interest from prior analyses and *MAPT* exon 2 excluders (purple) are indicated. **b** Sum of the fold change expression of all exon 2 includers in PSP and AD brain compared to controls (AMP-AD MAYO temporal cortex). Statistical comparison between sum expression in PSP compared to AD brain,

RSRC1 is differentially expressed in AD and PSP neurons in disease-relevant brain regions

While MAYO temporal cortex bulk RNA-seq data indicated altered expression of exon 2 splicing regulators in PSP and AD brain, these data may be influenced by altered cell type proportions in the disease context. Therefore, to validate

t test, Error bars ± SEM. **p < 0.01. **c** Single nuclei and single-soma *RSRC1* expression in AD entorhinal cortex, AT8-positive/negative neurons and PSP subthalamic nucleus. FC, fold change expression disease/AT8-positive compared to controls/AT8-negative. Depth of color indicates scaled average expression, size of dot indicates proportion of cells expressing *RSRC1*, also denoted by percentage value above each dot. MAST linear model with Bonferroni correction, **p < 0.01, ***p < 0.001. **d**-**f** PSI values for exons 2 (**d**), 3 (**e**) and 10 (**f**) in control, AD and PSP brain (AMP-AD MAYO temporal cortex). Red dashed line indicates mean PSI value in controls for each exon. One-way ANOVA with post hoc Tukey tests. Error bars ± SEM. *p < 0.05

neuronal and disease-specific patterns of expression of exon 2 splicing regulators, we assessed single nuclei sequencing (snuc-seq) from AD entorhinal cortex [22] and PSP subthalamic nucleus [52], as well as single-soma sequencing of hyperphosphorylated tau (AT8)-positive neurons from AD prefrontal cortex [47]. We found that while *RBM11* was not detectable in AD snuc-seq data, and was expressed at very low levels in the other datasets, RSRC1 was consistently detected and more highly expressed across data sets. While RSRC1 expression was highest in microglia in both entorhinal cortex and subthalamic nucleus, we confirmed that it was also expressed in neurons in these regions (Supplementary Fig. 4A-B (online resource)). Consistent with data from bulk temporal cortex tissue, we observed significantly lower RSRC1 expression in AD tissue compared to controls (FC = 0.07, p < 0.01), as well as a lower proportion of RSRC1-expressing cells in AD compared to controls (8.9% vs 12.5%, respectively) (Fig. 3c). We observed the same fold change expression and reduction in RSRC1-expressing cells when assessing neuronal populations specifically (Fig. 3c), although due to the small proportion of neurons present in the data (Supplementary Fig. 4C (online resource), this was not significant. Interestingly, RSRC1 expression was also higher in neurons derived from AD prefrontal cortex that were negative for hyperphosphorylated tau (AT8-), compared to AT8 + neurons (FC = 0.13, $p = 3.33 \times 10^{-33}$) (Fig. 3c, Supplementary Fig. 4D (online resource)), indicating that there may be an interaction between RSRC1 expression, MAPT splicing regulation and the formation of tau pathology.

In contrast, we found significantly higher RSRC1 expression in PSP subthalamic nucleus cells compared to controls (FC = 0.04, p < 0.01), as well as a higher proportion of RSRC1-expressing cells in PSP (10% compared to 7% controls) (Fig. 3c). These differences were exacerbated when assessing neurons alone (FC = 0.08, 17% PSP neurons vs 10% control neurons) (Fig. 3c), but similar to the AD data, the small proportion of neurons in this dataset (Supplementary Fig. 4E (online resource)) precluded these data from reaching statistical significance. Interestingly, we were able to detect the opposite pattern of effect for the exon 2 excluders QKI and PRPF38B in AD and PSP neurons by snuc-seq: consistent with the temporal cortex bulk data, expression of OKI and PRPF38B were higher in AD neurons (OKI FC = 0.239, *PRPF38B* FC = 0.04) and lower in PSP neurons compared to controls (QKI FC = -0.03, 47.8% PSPvs 44.4% control neurons, *PRPF38B* FC = -0.125, 15.7% PSP vs 12.5% control) (Supplementary Fig. 4F (online resource)). These data therefore support our assertion of differential expression of MAPT exon 2 regulators between AD and PSP brain. Furthermore, this demonstrates that SF/ RBP expression is altered in neurons in disease-relevant brain regions.

MAPT N-terminal isoforms are expressed at different ratios in AD and PSP brain

As we found evidence of coordinated splicing between *MAPT* exons 2 and 10, but observed differential expression of only exon 2 and exon 2 regulators in AD and PSP brain,

we hypothesized that there may be loss of coordinated combinatorial splicing regulation between N- and C-terminal MAPT in tauopathy brain. We therefore carried out targeted MAPT isoform (iso)-seq on temporal cortex tissue from $6 \times \text{control}, 6 \times \text{AD}$ and $6 \times \text{PSP}$ cases to assess the expression of full-length transcripts (Fig. 4a-c). From control and PSP brain, we detected ~ 150,000 reads mapping to the 6 main MAPT isoforms (control = 157,561; PSP = 143,820), whereas only 24,237 reads were mapped in AD brain tissue, possibly due to longer post-mortem intervals and more severe degeneration of neurons in these cases. We observed similar ratios of expression for each isoform as previously described by western blot analyses [59]: 1N3R and 0N3R were the two most highly expressed isoforms (~30% and 25%, respectively), followed by 0N4R (~21%) 1N4R (~15%) and finally very low expression of both 2N isoforms 2N3R (~1.4%) and 2N4R (~0.8%) (Fig. 4a). This pattern of expression was largely similar in AD and PSP cases; however, there was a trend towards increased expression of both 0N isoforms in AD brain compared to controls (AD 0N3R $42.5\% \pm 12.7\%$ vs $25\% \pm 5\%$ controls, AD 0N4R $31.6\% \pm 3\%$ vs $21\% \pm 4.6\%$ controls), although due to high variability and lower read mapping, these differences did not reach statistical significance (Fig. 4a). We then compared the 4R:3R ratios for each N-terminal isoform, and found that despite increased expression of 0N isoforms in AD, there was no difference for either AD or PSP in the 0N4R:0N3R ratio (Fig. 4b). In contrast, we observed a trend towards an increase in exon 2-containing 4R:3R ratios in PSP cases compared to controls (1N4R:1N3R PSP = 1.1 ± 0.38 vs 0.53 ± 0.07 controls, 2N4R:2N3R PSP = 0.8 ± 0.13 vs 0.55 ± 4.9 controls) (Fig. 4b), consistent with both our observation of increased exon 2 inclusion in temporal cortex (Fig. 3d) and the known pathological accumulation of 4R tau isoforms in PSP pathology. Lastly, when comparing N-terminal isoform expression, we found no differences in PSP brain, but a trend towards reduced 1N/0N and 2N/0N ratios in AD brain specifically (1N/0N AD = 0.43 ± 0.13 vs 1.2 ± 0.33 controls, 2N/0N AD = 0.02 ± 0.01 vs 0.05 ± 0.01 controls) (Fig. 4c), likely due to the increase in expression of 0N isoforms (Fig. 4a). Interestingly, we also observe an increase in the 2N/1N ratio in AD brain $(0.1 \pm 0.03 \text{ vs})$ 0.05 ± 0.005 controls) (Fig. 4c), which may be due to slightly decreased 1N expression or increased 2N3R expression we observe in AD compared to controls (Fig. 4a).

To examine whether these transcriptional changes were apparent at the protein level, we carried out western blot analyses in the same tissues from the same individuals (Fig. 4d–g). Consistent with the direction of the trends observed in the iso-seq data, there was a significantly increased 1N4R:1N3R ratio in PSP brain compared to controls (control 1N4R:1N3R ratio = 0.52 (SEM = 0.1), PSP 1N4R:1N3R ratio = 1.7 (SEM = 0.4), p = 0.009), which was



√Fig. 4 Coordination of N- and C-terminal splicing regulation is altered in AD and PSP brain, and is associated with tau pathology. a-c Proportion of each full-length MAPT isoform (a), 4R:3R ratio for each N-terminal isoform (b) and N-terminal isoform ratios (c) as detected by targeted MAPT iso-seq in human control, AD and PSP temporal cortex. One-way ANOVA with post hoc Tukey tests, all comparisons did not reach statistical significance. N=6. Error bars ± SEM. d Dephosphorylated tau isoform expression in PSP temporal cortex compared to tau ladder detected by specific N-terminal antibodies against 0N, 1N and 2N. Anti-1N tau showed poor detection for 1N4R isoforms, so anti-4R tau antibody RD4 was used for detection of this isoform. GAPDH used as loading control. e Quantification and 4R:3R ratio of N-terminal isoforms in d. Each point denotes a different individual brain lysate, N=6. Error bars \pm SEM. Student's t test **p < 0.01. f Dephosphorylated tau isoform expression in AD temporal cortex compared to tau ladder with same antibody detection as in d. GAPDH used as loading control. g Quantification and 4R:3R ratio of N-terminal isoforms in f. Each point denotes a different individual brain lysate, N=6. Error bars \pm SEM. Student's t test *p < 0.05, **p < 0.01. h Representative images of labeling of control, AD and PSP temporal cortex with marker of hyperphosphorylated tau, AT8, indicating different tau pathologies present across cases. Sections counterstained with hematoxylin and eosin. N=3-4. Scale $bar = 100 \mu m$. i Representative images of tau pathology labeling in control, AD and PSP temporal cortex with anti-0N, 1N and 2N tau antibodies from several individuals. Sections counterstained with hematoxylin and eosin. N=3-4. Scale bar = 100 µm

largely driven by a reduction in 1N3R tau (Fig. 4d, e). In contrast, there was no difference in either 0N or 2N 4R:3R ratios in PSP (Fig. 4d, e). In AD brain, there was an accumulation of soluble 0N and 2N isoforms by western blot, consistent with the iso-seq data (Fig. 4c, f, g). When examining 4R:3R ratios for each N-terminal isoform, we observed significantly increased 0N4R:0N3R (control ratio = 0.83 (SEM = 0.05), AD ratio = 1.49 (SEM = 0.15), p = 0.002) and 2N4R:2N3R ratios (control ratio = 0.83 (SEM = 0.05), AD ratio = 1.49, p = 0.03) in AD brain compared to controls (Fig. 4f–g), indicating that while there were no transcriptional differences in the 4R:3R ratio for these isoforms, there may be impaired degradation of 0N4R and 2N4R tau in AD resulting from their increased expression.

Pathologically aggregated tau in PSP and AD brain are associated with different N-terminal isoforms

While western blot analysis of AD and PSP temporal cortex revealed differences in the accumulation of soluble N-terminal tau isoforms, we wanted to determine whether the formation of different neuropathological features between tauopathies may be due to the insoluble aggregation of different N-terminal tau isoforms. After validating the specificity of each N-terminal antibody by overexpressing different tau isoforms in N2a cells (Supplementary Fig. 5A-B (online resource)), we carried out immunohistochemistry (IHC) on control, AD and PSP brain sections from the temporal cortex for hyperphosphorylated pathogenic tau (AT8; Fig. 4h)) and each N-terminal isoform (Fig. 4i). We observed the anticipated hyperphosphorylated tau neuropathology in both PSP and AD brain (Fig. 4h), specifically the widespread presence of neurofibrillary tangles and neuropil threads throughout the AD cortex, and sparse glial plaques and neurofibrillary tangles in PSP tissue. In comparison, there was little to no signal in control brain (Fig. 4h).

There was little signal for 0N tau in PSP brain (Fig. 4i), although in one case we observed sparse labeling of neuropil threads or possible glial involvement (Fig. 4i). In AD brain the 0N antibody did not label neurofibrillary tangles, but we did observe labeling of neuropil threads and dystrophic neurites surrounding amyloid plaques (Fig. 4i). Interestingly, in one case, the 0N antibody labelled thorny astrocytes consistent with an age-related tau astrogliopathy (ARTAG) pathology that was not visible with the AT8 antibody (Fig. 4h, i). While it is surprising that there was little immunolabeling of 0N Tau in human brain, given the high levels of 0N transcripts, this pattern was replicated with a second antibody against 0N Tau (Supplementary Fig. 5C (online resource)).

1N Tau immunostaining was primarily present in neurofibrillary tangles and pre-tangles (Fig. 4i) throughout the cortex in all three PSP cases, as well as neuropil granules and threads. In AD, this isoform was also the most prevalent in neurofibrillary tangles (Fig. 4i), but was primarily present in dystrophic neurites surrounding amyloid plaques (Fig. 4i). Finally, while 2N Tau was observed in some neurofibrillary tangles in PSP and AD brain (Fig. 4i), these were less common than the 1N labelled neurons. 2N Tau was also observed in dystrophic neurites surrounding amyloid plaques in AD brain, but this labelling was far less dense than the 1N Tau and less tightly co-localized with plaques (Fig. 4i). A second 2N antibody revealed a similar labeling of neurofibrillary tangles in AD and PSP brain, but less involvement in dystrophic neurites (Supplementary Fig. 5C (online resource)).

To directly compare the accumulation of different tau N-terminal isoforms in pathogenic inclusions, we carried out Opal multiplex labelling of adjacent brain sections from the same individuals using all three N-terminal antibodies in conjunction with AT8 and β -amyloid staining (Fig. 5a, b, Supplementary Fig. 6A-B (online resource)). Consistent with the IHC staining, we observed primarily 1N and 2N tau in AT8-positive neurofibrillary tangles in PSP temporal cortex, but all three N-terminal isoforms were present in ADassociated tangles (Fig. 5a, b, Supplementary Fig. 6A-B). Dystrophic neurites surrounding amyloid plaques were primarily associated with 0N and 1N accumulation, with less 2N involvement (Fig. 5a, Supplementary Fig. 6A (online resource)). In contrast, amyloid plaques present in either controls or PSP cases were not associated with any tau staining (Supplementary Fig. 6B (online resource)). Interestingly, 2N tau was absent in glial pathology observed in both AD and PSP cases, suggesting that 2N tau is unable to accumulate in glia, while astrocytic tufts in PSP brain were labelled



Fig.5 N-terminal isoforms accumulate differently in AD and PSP neuronal and glial pathologies. **a** Representative images of multiplex immunofluorescent labeling of AD temporal cortex with AT8 (red), β -amyloid (green), 2N tau (blue), 1N tau (yellow) and 0N tau (orange), and overlay of all three N-terminal tau antibodies in 4 different individuals. Examples of tau accumulation in dystrophic neurites can be found in AD1 and AD2, thorny astrocytes present

in AD3, and an example of a neurofibrillary tangle shown in AD4. N=4, scale bar=50 μ m. **b** Representative images of multiplex immunofluorescent labeling of PSP temporal cortex from 3 individuals as in **a**. Examples of early and pre-tangles shown in PSP1 and PSP3, while examples of astrocytic tufts are shown in PSP2. N=3, scale bar=50 μ m

primarily by 1N tau (Fig. 4i), consistent with the increased accumulation of 1N4R tau isoforms we observed by western blot and transcriptomic analyses.

Discussion

To date, the contribution of N-terminal MAPT splicing to disease pathogenesis has largely been overlooked compared to evaluation of exon 10 splicing and 4R tau expression. However, N-terminal tau is relevant to disease pathogenesis: for example, N-terminal fragments are prominent in AD cerebrospinal fluid (CSF), and their secretion from cells can be inhibited by the presence of exon 2 [14, 36]. In contrast, 0N Tau is more readily cleaved and released from human neuroblastoma cells [36]. This is consistent with our IHC data, where we observe little ON tau accumulation in neurons, but prominent 1N and 2N tau in neurofibrillary tangles. The regulation of tau release by N-terminal inserts also has implications for our understanding of tau spread and seeding, as different isoforms may be available extracellularly, and exhibit different seeding competencies. Furthermore, aberrant folding of N-terminal tau is one of the earliest pathological changes identified in tauopathies [11], thus supporting the assertion that N-terminal splicing is a relevant consideration when modeling and investigating tauopathy.

N-terminal tau splicing may play a role in modifying tau subcellular localization and aggregation propensity. The N-terminal contains a plasma-interacting domain [4] that interacts with synaptic proteins and Annexin A6 [17, 56], which results in retention of tau in the axonal compartment. While exons 2 and 3 are not within this domain, it is possible that they modify these interactions and impact the subcellular localization of tau, resulting in the increased propensity for certain isoforms to accumulate in these regions. Indeed, murine 0N tau has been found to localize in axons, whereas 1N was enriched in dendrites and 2N tau was depleted from cytoskeletal structures [41], indicating that N-terminal splicing likely modifies tau function. 1N tau has also been found to more readily accumulate and aggregate: the presence of exon 2 promotes the fibrillary extension of tau filaments in vitro [65] and exon 2-containing proteins more readily polymerize than 0N tau [37], therefore increased exon 2 inclusion would be likely to worsen tau aggregation. This is consistent with our observation of strong 1N tau immunostaining in PSP astroglia and tangles in both PSP and AD neurons. Despite this, we observe increased 0N expression in AD brain. However, the resulting protein accumulation was soluble, and associated with dystrophic neurites surrounding amyloid plaques rather than in neurofibrillary tangles. N-terminal tau splicing has also been found to be required for specific interactions with proteins associated with synaptic signaling and the plasma membrane [42],

supporting the assertion that different N-terminal isoforms likely facilitate distinct cellular functions. Characterizing the disruption of N-terminal splicing is therefore important for understanding tau biology and the mechanisms underlying disease pathogenesis.

We have identified coordinated regulation of MAPT exons 2 and 10, indicating that N- and C-terminal splicing of either region likely does not occur fully independently of the other. This phenomenon has been reported once previously using polony-based exon profiling [12]. Disrupting this coordination will therefore lead to imbalanced expression of different tau isoforms. Interestingly, while the expression of numerous exon 10 splicing regulators were altered between AD, PSP and control brains, we observed enrichment of exon 2 regulators with opposing patterns of differential expression between PSP and AD. As anticipated from this pattern of expression, we observed increased exon 2 inclusion in PSP and reduced exon 2 in AD. However, assessment of fulllength isoforms by iso-seq and western blot revealed that shifts in N-terminal splicing appear to be coupled to alterations in the 4R:3R ratio, supporting our hypothesis that loss of coordinated regulation between N- and C-terminal splicing contributes to tauopathy pathogenesis. The change in the 4R:3R ratio for specific N-terminal isoforms may explain why we did not observe an increase in exon 10 inclusion in PSP by short-read bulk RNA-seq; the most highly expressed 0N isoforms did not exhibit a change in the 4R:3R ratio in PSP brain, therefore the lack of change in 0N4R may have diluted out increases in 1N or 2N4R. Curiously, the increased 1N4R:1N3R ratio observed in PSP appeared to be largely due to a loss of 1N3R rather than an increase in 1N4R tau, thus raising the possibility that in combination with 1N4R tau accumulation, losing 1N3R tau expression and function could also be detrimental to neuronal health.

Aberrant regulation of splicing is a known phenotype of some forms of inherited tauopathy [1], which is hypothesized to be due to the sequestration and mislocalization of SF/RBPs to the cytosol and into stress granules [1]. SF/ RBP dysfunction is therefore a likely mechanism underlying aberrant *MAPT* splicing in non-familial AD and PSP. While we do not characterize the mechanism of SF/RBP disruption in AD and PSP brain here, we do identify differential expression of numerous SF/RBPs between AD and PSP compared to controls, which is suggestive of separate downstream effects of splicing dysregulation that ultimately contribute to the pathogenesis of either disease.

We found that *MAPT* splicing is likely regulated by numerous splicing factors, of which *RSRC1* and *RBM11* may be of particular interest. However, it is likely that there are many other modifiers that were not identified in our screen. Several of our SF/RBPs of interest, including *SNRPB*, *SNRNP25*, *THOC7* and *THOC3*, are known to be components of protein complexes that regulate splicing, and therefore would be unlikely to be isolated by the RNA pull-down assay. Indeed, overexpression of some of these SF/RBPs was able to significantly shift the 4R:3R ratio in human neuroblastoma cell lines. While expressed in brain and in neurons, many of these SF/RBPs are ubiquitously expressed in many different tissues and cell types. Indeed, we observed the highest expression of *RSRC1* in microglia in human brain snuc-seq data. Therefore, while their dysregulation may be impacting *MAPT* splicing in neurons, there will likely be wider effects of altered expression and splicing in other neural cell types that may also be relevant for disease pathogenesis.

RSRC1 is a member of the serine- and arginine-richrelated protein family, which are highly conserved regulators of alternative splicing, but how RSRC1 regulates this process is unknown. It is hypothesized that RSRC1 plays a role in 3' splice site selection by interaction with splicing regulators U2AF and SRSF2 [10], although it also possible that it may interact directly with pre-mRNA via its RS (arginine-serine) domain. However, there is no specific RNA motif that has been characterized as binding RS domains; thus, the region in which RSRC1 may be binding MAPT pre-mRNA is currently unknown. Mutations within this gene have been associated with intellectual disability [50, 51], whereas the silencing of RSRC1 in SH-SY5Y cells has been associated with downregulation of genes associated with schizophrenia, Alzheimer's disease and dementia [50], thus indicating the relevance of this gene for brain function.

RBM11 is a brain-specific splicing factor that exhibits fluctuating expression with brain development, with high expression throughout embryogenesis, peaking at perinatal days 0-3 [49], after which MAPT exon 10 expression increases [25], consistent with our observations that RBM11 expression may promote exon 10 exclusion. RBM11 is associated with the choice of 5' splice sites and may antagonize the activity of other SF/RBPs such as SRSF1 [49], potentially regulating MAPT splicing by direct interaction with pre-mRNA and by inhibiting binding of competing SFs/ RBPs. RBM11 is downregulated in the PS19 mouse model of tauopathy [1], consistent with the direction of effect we observe in AD brain. However, this mouse model expresses only 1N4R tau and as such the effect of RBM11 disruption on MAPT splicing was not measurable in this model. It should be noted that we were unable to validate RBM11 expression in snuc-seq data as its expression was very low; therefore, the relevance it may have to tauopathy and MAPT splicing requires additional investigation.

We were unable to identify regulators of *MAPT* exon 3 splicing from these data, or to compare its regulation between 17q21.31 H1 and H2 haplotypes due to the low frequency of H2 carriers. Increased Exon 3 inclusion is consistently identified on the H2 background [38, 59], an effect we also observe in these data. However, the mechanism

underlying increased exon 3 inclusion, and whether its expression is protective against tauopathy is currently unknown, although it may reduce the fibrillization of tau [65]. It should be noted that exon 3, and subsequently 2N tau expression, is very low in adult human brain (accounting for less than 3% of all transcripts in our targeted iso-seq data); therefore, the extent to which it may contribute to disease is unclear. Nevertheless, we observe some alterations in 2N expression and accumulation in AD and PSP, the most striking of which was the absence of 2N tau in glial pathology, indicating that 2N tau is either not released from neurons or is not internalized or aggregated by astrocytes. These data have implications for the design of experimental models of tauopathy where a single tau isoform is expressed to ensure the most disease and pathology appropriate isoform is utilized.

In conclusion, we propose that changes in SF/RBP expression result in differential splicing of the MAPT N-terminus between AD and PSP, resulting in the expression of isoforms with different aggregation properties and subcellular localizations, thus explaining the distinct neuropathological phenotypes of each disease. It would therefore be of great interest to investigate the role of N-terminal splicing in other primary tauopathies associated with different pathologies, such as Pick's disease (PiD), primary age-related tauopathy (PART), age-related tau astrogliopathy (ARTAG) and chronic traumatic encephalopathy (CTE) to determine whether these diverse disorders also exhibit loss of MAPT exon 2 and 10 splicing coordination. These data indicate that it is unlikely that exon 10 splicing is alone in underlying and regulating disease pathogenesis and tau neuropathology in either AD or PSP, but rather the combinatorial expression of specific and N- and C-terminal MAPT isoforms is relevant for understanding the development of tauopathy. While alterations in the 4R:3R ratio are undoubtedly important and relevant to our understanding of tau pathogenesis, N-terminal splicing is likely to be an important modifier of disease and pathology, and should be carefully assessed.

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LMO. Formal analysis: KRB, KF. Investigation: KRB, DAP, LMO. Resources: JDC, TR, KF, KW, JFC, AP, AMG. Data curation: KRB. Writing—original draft: KRB. Writing—review and editing: KRB, DAP, LMO, KF, KW, JDC, JFC, AP, AMG. Visualization: KRB. Supervision: AMG. Funding acquisition: KRB, JFC, AMG.

Declarations

Conflict of interests AMG: Scientific advisory board (SAB) for Denali Therapeutics (2015-2018), SAB for Pfizer (2019), SAB for Genentech, consultant for GSK, AbbVie, Biogen and Eisai. All other authors declare no competing interests.

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