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Review



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Secondary structures in RNA synthesis, splicing and translation

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ABSTRACT

Even though the functional role of mRNA molecules is primarily decided by the nucleotide sequence, several properties are determined by secondary structure conformations. Examples of secondary structures include long range interactions, hairpins, R-loops and G-quadruplexes and they are formed through interactions of non-adjacent nucleotides. Here, we discuss advances in our understanding of how secondary structures can impact RNA synthesis, splicing, translation and mRNA half-life. During RNA synthesis, secondary structures determine RNA polymerase II (RNAPII) speed, thereby influencing splicing. Splicing is also determined by RNA binding proteins and their binding rates are modulated by secondary structures. For the initiation of translation, secondary structures can control the choice of translation start site. Here, we highlight the mechanisms by which secondary structures modulate these processes, discuss advances in technologies to detect and study them systematically, and consider the roles of RNA secondary structures in disease.

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1. Introduction

mRNAs are essential molecules in the cell as they are key to extracting information stored in the DNA. Although the function of mRNA molecules is primarily determined by the nucleotide sequence, some properties are determined by secondary structures. Secondary structures are defined as distinct features, including hairpins, long range interactions, G-quadruplexes, R-loops and pseudoknots and they are formed as a consequence of the interactions of non-adjacent nucleotides. Their presence can impact various processes involving the mRNA, including synthesis, splicing and translation. Secondary structures are dynamic and can be modulated by multiple proteins, in particular RNA binding proteins (RBPs), and as they cannot be predicted solely from the primary sequence they are challenging to study. Nevertheless, several assays are available for both in vitro and in vivo profiling, and in this Review, we summarize these methods, provide an overview of some of the elucidated and putative functional roles of mRNA secondary structures, and finally we discuss their impact on disease. We discuss the consequences of secondary structure formation for splicing and translation, with particular focus in G-quadruplexes, hairpins and long range interactions. We also discuss the contribution of secondary structures in the regulation of mRNA splicing and in translation initiation and discuss the mechanisms involved.

2. RNA secondary structure formation

In RNA, intra and intermolecular long-range interactions, including hairpins, pseudoknots, and G-quadruplexes, are com-

monly observed. Hairpins are composed of a hybridized stem and a single stranded loop (Fig. 1a and b) and can contain mismatches and bulges. Pseudoknots contain nested stem-loop structures, with half of one stem intercalated between the two halves of another stem. G-quadruplex formation is driven by the inherent propensity of guanines to self-assemble, in the presence of monovalent cations, into planar structures known as G-quartets [1]. Each G-quartet is composed of four guanine nucleotides that interact with each other through Hoogsteen hydrogen-bonds. Consecutive runs of guanines (G-tracts) may lead to the formation of consecutive G-quartets that can stack with each other to form G-quadruplex structures (Fig. 1c). Biophysical properties such as the length of intervening loops between consecutive G-runs influence their formation dynamics. In addition, G-quadruplexes can be intramolecular or intermolecular. During transcription, dynamic hybrid structures between DNA and nascent RNA transcripts can be formed, such as R-loops (Fig. 1d) [2]. R-loops are three stranded hybrid structures in which an RNA molecule invades and hybridizes with one DNA strand, while displacing the other. The size of R-loops can range from <100 base pairs to >2000 base pairs [3]. Formation and stabilization of R-loops is particularly favorable when the non-template strand is Grich, but it can also be promoted by DNA supercoiling, the presence of DNA nicks, and the formation of G-quartets [3,4]. The impact of R-loop formation, as well as the formation of DNA and RNA G-quadruplexes and other secondary structures, impacts transcript elongation rates and can have a kinetic repercussion on co-transcriptional events involved in RNA processing, such as alternative splicing [5,6].



Fig. 1. RNA and DNA-RNA hybrid secondary structures. A. Hairpin formation in which the stem hybridizes with hydrogen bonds while the loop remains single stranded. **B.** A long range interaction with an imperfect hairpin containing a bulge **C.** A G-quartet is formed by four guanines linked with Hoogsteen hydrogen bonds with each other (shown as squares in brown). Hoogsteen base pairing is a type of non-Watson–Crick base pairing. G-quadruplexes are formed by the stacking of multiple G-quartets. **D.** Reloops are three stranded DNA:RNA hybrid structures that can be formed co-transcriptionally at the template strand. The nascent RNA produced by the RNAPII (**shown in green**) hybridizes with the template strand to form an R-loop structure, while the non-template strand remains single-stranded. Phosphorylation events in the Carboxy-Terminal Domain (CTD) of RNA polymerase II are shown in yellow. In schematics A, B and D thicker lining of the mRNA indicates exonic regions whereas thinner lining indicates intronic regions. (For interpretation of the references to color in this figure legend, the reader is referred to the web version of this article.)



Fig. 2. Mechanisms by which structure formation influences splicing. A. In the absence of secondary structures, RNAPII elongation rate is higher, which disfavors the recruitment of splicing factors that promote assembly of the spliceosome and exon definition. In this situation exons flanked by weak splice sites may not be recognised, and they are consequently skipped. Exons flanked by strong splice sites can be efficiently recognized by small ribonucleoproteins (snRNPs) U1 and U2, leading to the formation of the pre-spliceosome (complex A) and promoting exon definition and inclusion in the mature mRNA transcripts. **B.** Formation of secondary structures at DNA and RNA can decrease RNAPII elongation speed. For example, during transcription R-loops formed at the 3' of genes can be stabilized by non-template DNA G-quadruplex formation. Low transcription rates promote exon inclusion by allowing the formation of secondary structures and binding of proteins that can favor the recognition of weak splice sites that would not be recognized otherwise. An RBP that recognizes and binds to the secondary structure is shown in green whereas an RBP whose binding is inhibited by secondary structure formation is shown in red. **C.** RNA secondary structures can modulate mRNA interactions with RBPs either promoting or inhibiting their binding at the mRNA molecule. For example, G-quadruplexs formed at the DNA or RNA level can selectively recruit RBPs to influence splicing outcome. In schematics A, B and C, thicker lining of the mRNA indicates exonic regions whereas thinner lining is intronic regions. The dashed line of mRNA molecules indicates that the length of the transcript can be longer than displayed. (For interpretation of the references to color in this figure legend, the reader is referred to the web version of this article.)

A number of methods that probe RNA structures have been developed. Methods such as selective 2'-hydroxyl acylation analyzed by primer extension (SHAPE)-seq [7] and parallel analysis of RNA structure (PARS) [8] were able to identify RNA structures *in vitro*, while more recent methods can deduce structures *in vivo* [9,10]. For instance, RNA in situ conformation sequencing (RIC-seq) [11] is a powerful new method that enables global detection of intra- and intermolecular RNA-RNA interactions, such as

duplexes and long-range loop-loop interactions. Cross-linking immunoprecipitation high-throughput sequencing (CLIP-seq) enables the investigation of protein interactions with RNA molecules [12] from which many variant technologies have emerged. RNA G-quadruplexes can be characterized transcriptome-wide [13,14] using rG4-seq, which is a modified sequencing method that stalls at RNA G-quadruplexes, enabling identification of RNA G-quadruplexes *in vitro*, and RNA G-quadruplexes have also been visualized *in cellulo* using a specific antibody [15]. Moreover, researchers have developed small molecules, such as carboxypyridostatin, a cyanine dye called CyT and Thioflavin T [15-19], that can shift the equilibrium between the folded and unfolded state of RNA G-quadruplexes and which display preference for RNA over DNA G-quadruplexes. Identification of R-loops has been enabled by usage of specific antibodies [20-23] and other nuclease-based methods [24,25].

3. RNA polymerase speed and secondary structures

A variety of features are associated with RNAPII speed. For instance, the presence of introns and the length of the first intron are both positively correlated with RNAPII speed [26], while nucleosome formation can reduce RNAPII speed [27,28]. Regions with high propensity of forming DNA, RNA, or hybrid secondary structures are also associated with RNAPII pausing or slower RNAPII speed (Fig. 2a and b) [29-31]. Another example of structure remodeling due to slower RNAPII speed is inhibition of hairpin formation due to competition with other alternative structures resulting in reduced binding by stem-loop-binding proteins [30]. In S. cerevisiae and S. pombe, folding energy and GC content in the transcription bubble have been correlated with RNA polymerase distribution, and RNA structures within nascent transcripts promote forward translocation of the polymerase and limit backtracking [32]. This indicates how nascent RNA structures can promote the forward movement of an RNA polymerase molecule. Analyses of nascent RNAs have provided evidence that the formation of secondary structures within introns is associated with more efficient co-transcriptional splicing, which is favored under slower transcriptional rates [32,33]. Taken together, secondary structures will impact several processes, including promoter-proximal pausing, exon recognition, splicing and transcription termination, as they are all influenced by RNAPII speed.

4. RNA splicing and secondary structures

Pre-mRNA splicing is a key biological process that enables the removal of introns and the joining of intervening exons, eventually resulting in a mature mRNA molecule. Alternative splicing affects approximately 90–95% of mRNA transcripts in humans [34,35] and most often occurs co-transcriptionally [33], while for a minority of transcripts it occurs post-transcriptionally [36]. Splicing is a highly conserved mechanism [37] that is pivotal for a number of biological processes such as cell growth, differentiation, immune response, neuronal development [38-40], while aberrant splicing is implicated in multiple diseases [41] including neurological disorders [42] and cancer [43].

Splicing is mediated through the spliceosome complex which recognizes splice signals, the key members being the 5' splice site (5'ss), the 3' splice site (3'ss), and the branch point. The recognition of these consensus sequences is commanded by U1 and U2 small nuclear ribonucleoproteins (snRNPs) and other auxiliary protein factors that are involved in early spliceosomal assembly. Since higher-eukaryotic genes are often interrupted by long introns, early spliceosomal complex assembly over exons recognizes both splice sites during a process commonly known as exon definition [37]. Nevertheless, computational analyses of vertebrate splice sites have shown that the consensus splicing signals only account for approximately half of the information required to accurately define exon/intron boundaries [34], suggesting that other regulatory elements such as RBP sites and secondary structures are crucial for splice site definition. Splice sites with sequences that are substantially different from the consensus signals lead to suboptimal recognition of splice sites (weak splice sites), and are often associated with alternative splicing events. Recent models using deep learning can predict to a large extent splicing events using the primary DNA sequence and can integrate the effects of mutations [44,45].

Even though the RNA structural code has been less explored [46], it is known that the effects of *cis*-regulatory elements can be modulated by the presence of RNA structures in nascent transcripts and in mature mRNAs [47]. Co-transcriptional transient RNA structure formation can impact splicing through RNAPII pausing and backtracking, which can have a direct kinetic effect over co-transcriptional splicing events [48]. One such example is the human ATE1 gene, where splicing of two mutually exclusive exons is regulated by competing long-range hairpin structures that span up to 30 kB [49]. Mutations that disrupted each of the secondary structures shift the equilibrium between the two exons indicating direct control of splicing outcome. Reduction of transcription rates can favor further formation of RNA secondary structures [30] and binding of splicing regulatory factors that can increase splicing efficiency therefore allowing the recognition of exons that are flanked by weak splice sites, which would otherwise be skipped [5,50] (Fig. 2a and b).

5. The interplay between RBPs and secondary structures

During the mRNA lifecycle, RBPs regulate to a significant extent diverse transcriptional and post-transcriptional stages including splicing, transportation, translation, stability and degradation. They bind to pre-mRNA molecules in the nucleus and regulate its maturation and transportation to the cytoplasm where they regulate translation and degradation. The number of proteins that can bind to RNA in humans is estimated to be more than 1,500, adding complexity to all the aforementioned programs [51].

RBPs can facilitate or inhibit the recognition of splice sites thereby acting as splicing enhancers or splicing silencers [46,52,53]. The majority of RBP motifs are not bound *in vivo* as demonstrated by high-throughput experiments that identify the sites where RBPs bind to endogenous RNAs such as cross-linking immunoprecipitation followed by high-throughput sequencing (CLIP-seq). One possible explanation is that RNA structures provide additional contextual features beyond the primary motif sequences (Fig. 2b and c), and it has also been shown that RNA secondary structure is predictive of binding [54,55]. Several studies have shown that during pre-mRNA synthesis the formation of RNA structures influences alternative splicing by diverse mechanisms [56,57], and that local RNA structure formation can impact splicing by modulating the accessibility of core splicing signals [58-60] as well as RBP binding sites [58,61,62].

An example of how RNA secondary structures can dictate the binding of specific RBPs, is provided by MBNL1 and U2AF65 binding to influence exon inclusion in the fifth exon of TNNT2 [63,64]. MBNL1 favors hairpins and when bound inhibits U2AF65, which favors a linear structure, from binding the polypyrimidine tract resulting in exon skipping. Additional evidence from mice shows that MBNL1 also binds the hairpin structure of exon F in TNNT3. Another example is elF3, which recognizes and binds to hairpin structures at 5'UTR to exert translational activation or repression [65]. Other studies have shown preferential binding of RBPs at RNA G-quadruplex sites, e.g. CNBP, which prevents RNA Gquadruplex structure formation and promotes translation [66] and FMRP, which preferentially binds RNA G-quadruplex structures [66,67]. Secondary structures and RNA binding proteins have been systematically investigated, enabling the identification of preferences of structured RNA for particular proteins [68,69]. Interestingly, a recent genetic study showed that G-quadruplex sequences at 5'UTRs are selectively constrained and are enriched

Table 1

Important helicases that play a role unwinding RNA and DNA secondary structures. G4s in the table refer to G-quadruplexes. This a non-exhaustive list of relevant DNA/RNA helicases. Additional examples are reviewed by [92-94]. Alternative gene names are listed between parenthesis and gene paralogs with homologous functions are separated by "/

Gene name	Target	Molecular function	Associated phenotype upon loss of function experiments
PIF1	DNA G4	Prevent genome instability associated with DNA G4s and R-loops.	Absence or deficiency of PIF1 increases replication stress and induces
		[95,96].	DNA damage [95,96].
ERCC2	DNA G4	XPD is involved in nucleotide excision repair [97]. Evidence suggests	Knock down of XPD results in accumulation of G4s [99].
		that its helicase activity unwinds G4 during transcription [98].	
BLM	DNA G4	Unwinds a variety of structures DNA that emerge during DNA	Loss of functions mutations leads to Bloom syndrome [101]. Absence
	D-loops	replication, recombination and repair [100].	of BLM is associated with genome instability and excess of sister
	Holliday		chromatid exchange events at G4 loci [102].
	junctions		
WRN	DNA G4	Prevents genome instability associated with DNA G4s and R-loops	WRN loss of function leads to accumulation of G4s and expression
	R-loops	[103,104].	changes associated with G4-containing promoters [105].
DHX9	RNA G4	Involved in DNA replication, transcription and translation [106].	Absence of DHX9 promotes back-splicing events and induce
(DDX9)	R-loops	Resolves R-loop and H-DNA structures to promote genomic stability	translational repression of transcripts containing inverted-repeats
	H-DNA	[107-109].	Alu elements [110].
		Unwinds RNA G4s to control translation [80].	
DHX36	DNA/	Activates transcription by resolving DNA G4s at promoters	Formation of stress granules and increases protein kinase R (PKR)
	RNA G4	[111,112].	phosphorylation [113].
		Unwinds RNA G4s to control translation [80,113] and miRNA	Reduced telomerase efficiency and shorter telomeres [115].
		biogenesis [114].	Higher UV sensitivity due to lack of p53 expression [116].
DDX5/	DNA/	Paralogues that encode for helicases that resolve RNA hairpins and	Knock out leads to mouse embryonic lethality [118].
DDX17	RNA G4	G4s, having a regulatory role in alternative splicing and translation	DDX5/DDX17 absence impairs splicing and miRNA biogenesis during
	RNA	[84,86,117].	neuronal differentiation [119].
	Hairpins	DDX5 also resolves DNA G4s that control gene transcription [87].	
DDX21	RNA G4	Involved in ribosomal RNA biogenesis and anti-viral immune	DDX21 knock down results in increased expression of genes with G4
	R-loops	response [120-122].	motifs in their 3'UTR [83].
DDX1	RNA G4	Converts RNA G4 into R-loops [81].	DDX1 deficiency impairs class switch recombination in B cells [81]
DDX2A/	RNA	Paralogues that encode for the two subunits of the eukaryotic	DDX2A plays an essential role in spermatogenesis, whereas DDX2B
DDX2B	nairpins	translation initiation factor 4A (elf4A). These nelicases resolve KNA	is essential for mouse viability [123].
(EIF4A1/	KNA G4	nairpins and G4s located at the 5'-UTR, which has an impact on	
EIF4AZ)	Dlasma	Deschara B loops that are and during transprinting [124]	D loop commutation and comparis instability due to break down of
DDX41	R-100ps	Resolves R-loops that emerge during transcription [124].	R-loop accumulation and genomic instability due to knock down of
מסכעתת	P. loops	Spliceecomal balicase with roles in the removal of P loops [125]	P loop accoumlaton, genomic instability and replication fork stalling
(UAP56)	K-100ps	spinceosonial hericase with foles in the removal of K-loops [125].	[125]
SETX	R-loops	Senatavin removes R-loops to maintain genome integrity [126]	Knock down of Senatavin results in an increase in R-loops
SLIN	K-100p3	senatasin removes it loops to maintain genome integrity [120].	downstream of the poly(A) signal [127]
AOR (FMB4)	R-loons	Intron-hinding spliceosomal factor with helicase activity that	Cenome instability and deficiency in co-transcriptional gene
	10095	contributes to R-loop removal [128 129]	silencing pathways mediated by small RNAs [129 130]
		contributes to it loop removal [120,120].	Sherieng patienays measured by sharing [125,156].

for eQTLs, loci containing genetic variants that result in changes of the expression level of a gene, and RBP sites [70].

6. Helicases as key regulators of secondary structures

Structure formation is to a large extent modulated by enzymes such as eIF4A and DHX29, that can unwind them, and their importance is demonstrated by their pivotal role in translation initiation [71,72]. Similarly, the continuous activity of DNA/RNA helicases and ribonucleases H (RNAse H1 and H2) release R-loop structures [3]. Interestingly, R-loops and G-quadruplexes were both found to be unwound by the helicase DHX9 in humans [73]. DHX9 activity protects single-stranded DNA against damage and preserves genomic stability [74]. RNA G-quadruplexes are known to interact with several proteins [70,75,76]. For example, the RNA helicase RHAU (also known as DHX36) resolves mRNA G-quadruplexes [77,78]. One of its targets is a G-quadruplex at the 5'UTR of Nkx2-5 mRNA, and it has been shown that DHX36-mediated G-quadruplex structure unfolding is required for the gene to be expressed [79]. Another DHX36 target is *Gnai2* mRNA, a key regulator of stem cell function and muscle regeneration [78]. DHX36 and DHX9 were also found to modulate translational efficiency by resolving 5'UTR RNA G-quadruplexes [80], while several RBPs such as hnRNP H/F and helicases such as DDX21, DDX17 DDX3X, DDX5 and DDX1 have been found to unwind RNA G-quadruplexes and are also involved in transcription, splicing and translation regulation [81-84]. Similarly, multiple helicases have been shown to resolve hairpin structures. For instance, UPF1 can resolve RNA hairpins [85],

while DDX5 can resolve DNA and RNA G-quadruplexes as well as hairpin structures [86,87] (Table 1).

The cellular mechanisms mediating the stabilization and resolution of RNA secondary structures remain incompletely understood, as are the interactions between secondary structures and protein complexes. In addition, the effect of perturbing these mechanisms and their relevance to disease progression is unclear. High throughput screens coupled with short hairpin RNAs (shRNAs) or CRISPR-based technologies have enabled systematic interrogation of the roles of diverse proteins, such as RBPs, helicases, and topoisomerases [88-91]. Furthermore, mutational analysis with CRISPR-Cas9 could be used to study the effects of secondary structure disruption in vivo or in cellulo. CRISPRinduced mutations that destroy the secondary structure motifs, for example the G-runs of G-quadruplexes or the stem sequence of hairpins, but leave other regulatory sequences such as RBP motifs unchanged, could advance the understanding of how secondary structures determine gene expression.

7. G-quadruplexes as regulators of alternative splicing

G-quadruplex sequences are enriched at promoters and they have been extensively studied in this context [131]. Additionally, G-quadruplexes have been related to splicing, 3' processing, transcription termination, RNA localization and translation regulation [76]. Interestingly, it has been shown that G-quadruplex sequences have a high enrichment in the proximity of both 3' and 5' splice sites across a wide range of species. The effect is more pronounced at the non-template strand, suggesting that the G-quadruplexes are formed primarily by the RNA and that they may favor or block the binding of RBPs [132].

One of the first exemplary cases of RNA G-quadruplex mediated regulation of alternative splicing was found in the hTERT gene, which encodes for the catalytic subunit of the telomerase enzyme, and one of its exon skipping events is promoted by the stabilization of intronic G-quadruplexes [133]. Gomez and colleagues hypothesized that RNA G-quadruplex formation can prevent RBP binding to intronic enhancers, leading to exon skipping. However, based on different functional assays, RNA G-quadruplex formation has also been proposed to promote RBP binding to splicing regulatory elements [134-136]. Since G-quadruplex-dependent splicing events were often demonstrated by introducing mutations at Gquadruplex motifs, it was unclear from these results whether the G-quadruplex structure or the linear form of these G-rich sequences act as a splicing enhancer. To disentangle these effects. Huang and colleagues showed that mutations that prevent intronic G-quadruplex formation but keep G tracts intact, led to exon exclusion of an alternative exon in the CD44 gene [137]. Since the CD44 intronic G-quadruplex motif sequence can be bound by two RBPs that have the opposite effect on exon exclusion, RNA Gquadruplex formation may function as a switch to promote the binding of one RBP over the other [138]. In another recent study where the role of wild-type and mutated G-quadruplex sequences in alternative splicing was tested using a minigene, it was also shown that the presence of an RNA G-quadruplex favors exon inclusion [132], consistent with the aforementioned findings. There is also evidence of an interplay between RNA Gquadruplex stabilization and specific binding proteins such as HNRNP H/F [116,137] and HNRPU [139] and recent studies suggest that RNA G-quadruplex formation can modulate in vitro RBP binding to mRNA molecules [66].

The genome-wide effect of RNA G-quadruplex formation over splicing factor binding remains unclear. High-throughput screening of chemical compounds via dual-color splicing reporters has identified two small molecules, emetine and cephaeline, that disrupt RNA G-quadruplex formation [140]. Genome-wide evaluation of emetine effects on alternative splicing showed substantial alternative splicing changes after treatment, with nearly 60% being exon skipping events. It was also shown that multiple RBPs colocalize with G-quadruplex motifs flanking splice junctions, suggesting an interplay between RBP binding and RNA G-quadruplex structure formation, which was further corroborated by loss of function experiments followed by RNA-seq, identifying consistent associations for 36 RBPs [132,137].

8. Hairpins enable long range RNA interactions during splicing

Long range interactions are important for splicing modulation [141], and they are more enriched at weak alternative acceptor splice sites [142]. Some long range interactions can span several kilobases and can bring in proximity otherwise distant splice sites. One of the best-characterized examples of regulation of splicing through RNA structures can be found in *D. melanogaster* for the *DSCAM* gene, where RNA-RNA interactions, mediated through multiple structures, regulate the selection of exons within arrays of mutually exclusive exons [143,144]. In this case, RNA looping can bring splicing elements situated thousands of bases away from each other into close proximity.

Hairpins may also directly affect exon skipping events by a mechanism known as "looping-out", whereby inter-intronic base-pairing RNA interactions can loop out exons to promote their skipping [56]. This mechanism is supported by the enrichment of conserved complementary sequences present in intronic regions

flanking exon skipping events [145]. Moreover, the artificial introduction of self-complementary regions across exons suppresses exon inclusion in yeast, suggesting a causal relationship between hairpins and exon skipping [146]. Interestingly, the expansion of self-complementary regions is related to the primate-specific Alu retrotransposon, which is enriched in regions flanking alternative exons, suggesting a role in splicing regulation [147]. During back-splicing, an unconventional splicing mechanism, the second nucleophilic attack is performed over an upstream 3' splice leading to circular RNA (circRNAs) products. circRNAs are particularly abundant in the brain and RNA structures that favor backsplicing are often derived from complementary intronic sequences associated with Alu elements [148]. In zebrafish, hairpin formation between dinucleotide repeats that co-occur at opposite boundaries of an intron, mediate splicing without U2AF2, which is a major component of the spliceosome [149].

The formation of RNA structures can also enhance RBP regulatory range by bringing distal regulatory elements in close proximity with their exon targets [150]. This can be particularly important for RBFOX2 regulated exons since more than half of RBFOX2binding sites are found over 500 bp away from any annotated exons, and it has been shown that long-range RNA hairpin formation is necessary for the regulatory effect of distal binding sites [151]. It has also been shown that hairpin formation can influence splicing regulatory protein binding, with enhancers and silencers having a stronger effect when present in the loop relative to the stem [52,54], suggesting that RBP binding is inhibited at the stem [58,61]. In an elegant set of experiments, it was shown that in the case of FGFR2, the formation of a hairpin structure is required for efficient splicing from two mutually exclusive exons and its splicing effect is not dependent on its primary nucleotide composition as shown using minigene assays [152].

The fibronectin EDA exon is controlled by seven hairpins and a key exonic splicing enhancer is found in the loop of one of the hairpins, which is in turn bound by splicing regulatory proteins such as SRSF1 [153,154]. Other examples include a hairpin which modulates the inclusion of the alternative exon 6B of the Btropomyosin transcript in chicken [155]. It was also shown that a mutation in PS2 that deletes or destabilizes a hairpin in exon 5, results in higher levels of exon inclusion [156]. Importantly, the formation of hairpin structures could be dynamic and due to environmental changes, an example being temperature-dependent formation of a hairpin that controls splicing of APE2 gene in yeast [157]. In addition, alternatively spliced exons display an enrichment for secondary structures and evolutionary conservation of many of these structures indicates their important regulatory functions [57]. This is exemplified by conservation of secondary structures over the primary nucleotide sequence such as a conserved hairpin structure in RB1CC1 [57]. Advances in long-read RNA sequencing technologies will enable improved detection of longrange interactions and their impact in the regulation of alternative splicing events.

9. The role of RNA structures on RNA stability and decay

The half-life and decay rates of mRNA transcripts in human cells influence protein expression levels. A number of features determine transcript stability including GC content, transcript length, polyA tail length, RBP sites, microRNA binding sites, and mRNA secondary structures [158-163]. Structural features of mRNAs dictate to a large extent mRNA half-life with transcripts that have a structured coding sequence showing higher expression levels [159]. Hairpins in mRNA transcripts can result in increased stability [163-165], such as when found at the 3'UTR near mRNA cleavage sites. The accessibility of microRNA sites



Fig. 3. Mechanisms by which RNA structure formation influences translation. A. During cap-dependent translation, translation initiation factors (blue proteins) recognize the mRNA 5' cap structure (purple circle) and bridge its interaction with the 3' polyA tail, through polyA binding proteins (PABPs). During translation several helicases actively unwind the mRNA, which could remove secondary structures. This could lead to faster ribosome speeds, which may result in protein misfolding. **B.** Cap-dependent translation can be regulated by the dynamic formation of secondary structures in the 5' UTR. Hairpin formation can limit the binding of the ribosome and translation initiation factors, thereby repressing protein translation. The presence of G-quadruplexes in the 5' UTR may inhibit translation directly, activate upstream ORFs, or promote translation. **C.** Cap-independent translation can take place in the presence of IRESs, which require highly structured 5'UTR domains that indirectly interact with PBAPs to promote mRNA circularisation. Some IRES structures can be activated by RNA G-quadruplex formation. Further formation of RNA secondary structures across the ORF can limit the translation interpretation of the references to color in this figure legend, the reader is referred to the web version of this article.)

influences mRNA half-life and secondary structure formation can change the microRNA binding efficiency [166]. For example, the introduction of a hairpin in the 5'UTR of a transcript, results in substantial increases in gene expression [167,168]. Constitutive decay elements are RNA motifs that mediate the destabilization and degradation of mRNA molecules, and contain a hairpin

sequence [169] at which Roquin proteins bind to induce the decay of the transcript [170].

Massively parallel reporter assays are high-throughput technologies that enable rapid measurements of thousands of sequences for their regulatory activity and have received widespread adoption in recent years [171-174]. Multiple variants of this technology have been implemented to study a plethora of gene regulatory elements, including promoters, enhancers, 5' UTRs, and 3' UTRs, by placing synthetic sequences in the appropriate location relative to a reporter gene. In this case massively parallel reporter assay experiments have shown that its destabilizing effects increase as a function of the hairpin length [165].

10. Secondary structures in translation

Translation can be divided into four phases, initiation, elongation, termination and ribosome recycling [175,176]. Initiation is the rate limiting and most regulated step, consisting of several complex programs. The regulation of translation directly impacts protein levels with most regulatory mechanisms affecting the rate-limiting initiation step [177-179]. The multifarious effects of translational control can be observed across biological processes including development, differentiation, functions of the nervous system and disease [177,180]. Initiation can be either capdependent or cap-independent [181,182]. Cap-dependent translation is the most frequently used in eukaryotes and starts with the binding of eIF4E to the mRNA cap. The most common capindependent initiation mechanism, often utilized by viral RNAs, involves an internal ribosome entry site (IRES) of structured mRNA. IRES structures can recruit ribosomal subunits and eukaryotic initiation factors [183]. RNA molecules fold in complex configurations with the presence of RNA secondary structures in the 5'UTR being a major determinant of the rate of translation (Fig. 3a and b) [184-186]. Moreover, the ribosome itself is a major remodeler of RNA structure [187]. Lower translation rates can not only limit protein abundance, but can also enable correct co-translational protein folding [188,189]. In addition, secondary structures can influence the recognition of the IRESs (Fig. 3c).

Although the vast majority of eukaryotic translation start sites have an AUG codon, often the first AUG codon is bypassed, resulting in usage of more distal AUG codons and alternative protein isoforms. This process is referred to as leaky scanning, with a proportion of ribosomes initiating translation from downstream start codons. Leaky scanning and translational efficiency are influenced by the presence of secondary structures [8,190-192]. Moreover, there is a large proportion of suboptimal start sites that do not contain the canonical start codon. Microsatellite expansions can cause non-AUG initiation [193]. These non-AUG start sites are often associated with alternative translation start [194,195]. Ribosome profiling is one of the primary methods of identifying the occupancy of elongating ribosomes on mRNAs, therefore providing a direct readout of ribosome decoding rates [176].

Secondary structures can conceal or expose binding sites for translation regulators, and it has been shown that certain RBPs bind preferentially at structured RNA while others have a preference for linear forms [196]. Moreover, formation of secondary structures can change the distance between translation-associated motifs, an example being the distance between the stem-loop and the cap [197]. Secondary structure formation can also promote cap-independent translation, and the disruption of an IRES hairpin can in turn reduce translation efficiency in viral [198,199] and eukaryotic [200] mRNAs.

Riboswitches are components of mRNA molecules that can bind a small molecule and directly control gene expression through RNA conformational changes, without proteins being involved. They are found in both prokaryotes and eukaryotes, with most discovered riboswitches being present in bacteria and archaea [201]. The aptamer is a receptor for a small molecule, and it is usually located in the 5'UTR of a mRNA where it forms a secondary structure that binds to the small molecule. The expression platform is the regulatory domain of the riboswitch and it modulates gene expression upon binding of the small molecule. Riboswitches have been found to regulate a number of processes including initiation of translation [202], mRNA decay [203], transcription termination [204] and splicing [205,206]. For instance, in *E. coli* the lysine riboswitch when lysine is present it restricts translation initiation and also exposes RNase E cleavage sites [203].

RNA structures can directly interact with the translational machinery and influence the recognition of the translation start [207]. Note that the interaction is complicated by the fact that the translational machinery can unwind and remodel RNA structures [187]. There is also decreased translational efficiency at highly structured 5'UTRs [80,208]. For example, in the case of *BRCA1*, a tumor suppressor gene, a longer 5'UTR isoform is expressed only in breast cancer cells, resulting in a 10-fold decrease of translational efficiency due to the formation of a stable complex secondary structure [208]. Finally, the interplay between RNA structure formation and unwinding influences ribosome initiation, scanning and elongation. Therefore, secondary structures can account for differences between mRNA and protein levels [209].

11. Hairpins enable long range RNA interactions in translation initiation

Early studies indicated that hairpin formation can influence translation efficiency [210]. Hairpins with high thermal stability upstream of the translation start site resulted in reduced translation by up to 85–95%, whereas hairpin formation downstream of an AUG at specific positions resulted in an increase in translation rate by facilitating recognition of initiator codons by ribosomes [211,212]. Stem length and GC content, both of which increase thermal stability, inhibit translation, while more distant hairpins have a smaller inhibitory effect [213]. Other studies have also indicated that both the GC content of the stem and the positioning of the hairpin relative to the translation start site dramatically influence the translation efficiency [207].

Hairpins at the 5'UTR of ferritin-H and ferritin-L mRNAs act as an iron-responsive element controlling iron levels and are highly dynamic response elements to environmental changes [214]. Another example is a hairpin structure in the c-JUN 5' UTR which is recognized by eIF3 and is required for initiation of translation [215]. Another study generated a library of half a million 50 bp long 5'UTRs and identified hairpin structures to negatively impact protein levels, especially those with longer stems and shorter loops [216].

12. G-quadruplexes in translation initiation

RNA G-quadruplexes are enriched at 5'UTRs (Huppert et al. 2005) where they show a higher frequency at the template strand, suggesting a relative depletion of G-quadruplexes at the RNA level [217]. There is also a difference in the density of G-quadruplexes, with the highest density being found within 50 bp of the start of the 5'UTR and a declining frequency moving away from it [217]. It has been shown that G-quadruplexes in the 5'UTR of mRNAs are inhibitory elements [218], and several studies have since shown that G-quadruplexes at the 5'UTR interfere with the recognition by ribosomes [17,219-223]. Specifically, experiments involving luciferase plasmid vectors indicate that G-quadruplexes

inhibit expression across 5'UTR regions, perhaps by interfering with ribosome scanning. However, in many of these experiments the researchers used controls where guanines had been substituted for uracils, potentially also interfering with RBP binding sites and the GC content [218,219].

It has also been shown that G-quadruplexes at 5'UTRs of eukaryotic genes can promote translation by favoring recognition of the IRES [224-227]. In FGF-2, a gene that is associated with tissue development and repair, a G-quadruplex motif together with two hairpin sequences are found within the IRES, and they promote translation in a cap-independent translational program [225]. A G-quadruplex site in the RBP FMRP is a binding site for the protein itself, and it has been suggested that it could in this way control both its own expression levels [228] and its mRNA splicing [134]. In VEGF, an RNA G-quadruplex was shown to be essential for IRES-mediated translation initiation [227,229,230]; however other studies have contended its role and provided evidence for inhibitory functions [231,232].

A study that used massively parallel reporter assays to investigate mRNA translation found that G-quadruplexes in the 5'UTR act as translational inhibitors, and that knockdown of G-quadruplex resolving helicases aggravated these phenotypes [233]. It was also found that RNA G-quadruplex formation could promote the usage of an upstream translation start site by slowing down the preinitiation complex scanning [80]. The role of secondary structures was systematically explored in a high-throughput experiment where half a million 50 bp randomly generated 5'UTRs were synthesized and tested in yeast. The results showed that several secondary structures, including RNA G-quadruplexes and hairpins, are important contributors to expression levels [216]. RNA Gquadruplexes can either restrict or promote the recognition by ribosomes and even though there are more studies indicating inhibitory functions, it is not clear which effect is more widespread and what features determine if the G-quadruplex will restrict or promote ribosomal recognition.

13. Splicing and translation associated secondary structures in disease

Regions that are predisposed to secondary structure formation, such as G-quadruplexes have an excess of germline and somatic mutations [235,236]. The functional role of these structures is supported by the observation that eQTLs are enriched at G-quadruplexes within 5'UTRs and splicing quantitative trait loci (sQTLs) are enriched at G-quadruplex motifs flanking splice sites [70,132]. The accumulation of R-loops is also associated with genomic instability [237-240] As secondary structure formation modulates diverse processes including splicing and translation initiation, changes in the mRNA structure have been associated with and can result in human disease.

Mutations of alternative splicing factors can lead to R-loop accumulation, which may compromise genomic stability and be relevant in the context of cancer pathogenesis [241,242]. RNA splicing perturbation by expression of *U2AF1* or *SRSF2* mutants, mutations that are commonly observed in myelodysplastic syndrome, results in the accumulation of R-loops [243]. In the *MAPT* gene, also known as tau, in the interface between exon 10 and intron 10, there is a hairpin structure which can mask the splice site [244,245] and DDX5 was found to be involved in the resolution of this hairpin structure controlling splicing of MAPT (tau) exon 10 [86]. Mutations at the hairpin result in its destabilization, causing inclusion of exon 10 due to increased association with U1 snRNP [244] and results in higher prevalence of neurodegeneration. Hairpin sequences were also identified in the 5'UTR of other transcripts including the amyloid precursor protein [246] and α -synuclein

[247], indicating the importance of structure-mediated control of expression levels. In spinal muscular atrophy, a stem-loop RNA structure overlaps with the 5' splicing site of exon 7 of *SMN2* and interference with the structure formation is a therapeutic target against the spinal muscular atrophy molecular phenotype [248]. Sulovari et al. showed that variable number tandem repeats were particularly enriched at Alu elements and found an association between genes differentially spliced or expressed between human and chimpanzee brains [249].

RNA G-quadruplex structures have been identified in several cancer genes, including *TP53* and *TERT*, where they can modulate splicing and protein isoforms [133,135]. In CD44 an RNA G-quadruplex in intron 8 functions as a splicing enhancer with roles in the control of the epithelial–mesenchymal transition [137], a process that is important for cancer metastasis [250]. One of the canonical translation initiation factors, elF4A, is a DEAD-box RNA helicase that can unwind secondary structures, including RNA G-quadruplexes, and its activity is correlated with the number of secondary structures in the 5'UTR [251]. Perturbation of elF4A can contribute to oncogenesis as it results in formation of RNA G-quadruplexes in the 5'UTRs of mRNAs targeted by elF4A, including many oncogenes, transcription factors, and epigenetic regulators [252].

The expansion of microsatellite repeats at 5'UTRs has been associated with aberrant translation and has been implicated in multiple disorders [193,253]. The mechanisms involve the formation of secondary structures that interfere with translation and repeat-associated non-AUG translation. One of the most wellstudied examples is the expansion of the hexanucleotide GGGGGC in the first intron of the C9orf72 gene which results in frontotemporal dementia (FTD) and amyotrophic lateral sclerosis (ALS). These repeats form different secondary structures including Gquadruplexes, R-loops and hairpins [254-256] which leads to aborted transcription at the repeat site [254]. Expansion of these repeats results in repeat-associated non-AUG translation and the generation of toxic dipeptide proteins [257], while reducing DHX36 levels in cells derived from C9orf72-linked ALS patients results in reduced dipeptide protein burden due to the formation of RNA G-quadruplexes [258]. In ALS and FTD, Nucleolin binds to the G-quadruplex forming hexanucleotide repeat, resulting in its mislocalization in the cell [254]. In addition, a number of other proteins associated with the ALS pathology such as TDP-43, FUS/ TLS, hnRNPA1, hnRNPA2B1, hnRNPA3 and EWSR1 interact with the RNA G-quadruplex [259-264]. Encouragingly, G-quadruplex binding small molecules ameliorate the pathologies associated with ALS and FTD in model systems, indicating that RNA Gquadruplexes can pose as a therapeutic target [265]. Betaamyloid precursor protein cleaving enzyme 1 (BACE1) encodes a protein that cleaves amyloid precursor protein resulting in the generation of amyloid-beta peptide, the accumulation of which is a hallmark of Alzheimer's disease [266]. An RNA G-quadruplex in exon 3 of BACE1 modulates splicing by inhibiting the binding of hnRNP H, thereby promoting a shorter isoform without the proteolytic activity that creates the neurotoxic peptide [267]. ADAM-10 is also associated with Alzheimer's disease due to its antiamyloidogenic activity and a RNA G-quadruplex in its 5'UTR represses its expression [268].

14. Concluding remarks

RNA secondary structures are pervasive, interact with RNA binding proteins and are linked to a large number of important functions, including transcription, splicing and translation. Even though the functional importance of secondary structures has been repeatedly demonstrated, the contribution of RNA structures in these processes remains incompletely understood due to the difficulties in identifying dynamic RNA structures and their mechanisms of action. High-throughput technologies enable the systematic investigation of RNA secondary structures and the design of experiments to quantify their contribution in transcription, splicing and translation enables directly testing their mechanisms of action. New methods to dynamically identify RNA secondary structures are gradually revealing their widespread and diverse contributions in gene regulation. However, it remains difficult to capture their dynamic changes across cellular conditions and their interplay with proteins. The degree to which RNA secondary structure formation is influenced by the tissue and cell type remains largely unstudied. The availability of large scale single cell assays will enable the investigation of associations between secondary structures, the presence of various sequence motifs, and expression levels of RBPs across different cell types. Even more interesting could be the combination of single cell technologies with different small molecules that stabilize specific structures.

Declaration of Competing Interest

The authors declare that they have no known competing financial interests or personal relationships that could have appeared to influence the work reported in this paper.

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References

- Gellert M, Lipsett MN, Davies DR. Helix formation by guanylic acid. Proc Natl Acad Sci U S A 1962;48:2013–8.
- [2] Crossley MP, Bocek M, Cimprich KA. R-Loops as Cellular Regulators and Genomic Threats. Mol Cell 2019;73:398–411.
- [3] Santos-Pereira JM, Aguilera A. R loops: new modulators of genome dynamics and function. Nat Rev Genet 2015;16:583–97.
- [4] Duquette ML, Handa P, Vincent JA, Taylor AF, Maizels N. Intracellular transcription of G-rich DNAs induces formation of G-loops, novel structures containing G4 DNA. Genes Dev 2004;18:1618–29.
- [5] Dujardin G, Lafaille C, de la Mata M, Marasco LE, Muñoz MJ, Le Jossic-Corcos C, et al. How slow RNA polymerase II elongation favors alternative exon skipping. Mol Cell 2014;54:683–90.
- [6] Nieto Moreno N, Giono LE, Cambindo Botto AE, Muñoz MJ, Kornblihtt AR. Chromatin, DNA structure and alternative splicing. FEBS Lett 2015;589:3370–8.
- [7] Lucks JB, Mortimer SA, Trapnell C, Luo S, Aviran S, Schroth GP, et al. Multiplexed RNA structure characterization with selective 2'-hydroxyl acylation analyzed by primer extension sequencing (SHAPE-Seq). Proc Natl Acad Sci U S A 2011;108:11063–8.
- [8] Kertesz M, Wan Y, Mazor E, Rinn JL, Nutter RC, Chang HY, et al. Genome-wide measurement of RNA secondary structure in yeast. Nature 2010;467:103–7.
- [9] Spitale RC, Flynn RA, Zhang QC, Crisalli P, Lee B, Jung J-W, et al. Structural imprints in vivo decode RNA regulatory mechanisms. Nature 2015;519:486–90.
- [10] Ding Y, Tang Y, Kwok CK, Zhang Y, Bevilacqua PC, Assmann SM. In vivo genome-wide profiling of RNA secondary structure reveals novel regulatory features. Nature 2014;505:696–700.
- [11] Cai Z, Cao C, Ji L, Ye R, Wang D, Xia C, et al. RIC-seq for global in situ profiling of RNA-RNA spatial interactions. Nature 2020;582:432-7. <u>https://doi.org/ 10.1038/s41586-020-2249-1</u>.
- [12] Licatalosi DD, Mele A, Fak JJ, Ule J, Kayikci M, Chi SW, et al. HITS-CLIP yields genome-wide insights into brain alternative RNA processing. Nature 2008;456:464–9.
- [13] Kwok CK, Marsico G, Sahakyan AB, Chambers VS, Balasubramanian S. rG4-seq reveals widespread formation of G-quadruplex structures in the human transcriptome. Nat Methods 2016;13:841–4.

- [14] Zhao J, Chow EY-C, Yeung PY, Zhang QC, Chan T-F, Kwok CK. rG4-seq 2.0: enhanced transcriptome-wide RNA G-quadruplex structure sequencing for low RNA input samples n.d. https://doi.org/10.1101/2022.02.10.479665.
- [15] Biffi G, Di Antonio M, Tannahill D, Balasubramanian S. Visualization and selective chemical targeting of RNA G-quadruplex structures in the cytoplasm of human cells. Nat Chem 2014;6:75–80.
- [16] Di Antonio M, Biffi G, Mariani A, Raiber E-A, Rodriguez R, Balasubramanian S. Selective RNA versus DNA G-quadruplex targeting by in situ click chemistry. Angew Chem Int Ed Engl 2012;51:11073–8.
- [17] Gomez D, Guédin A, Mergny J-L, Salles B, Riou J-F, Teulade-Fichou M-P, et al. A G-quadruplex structure within the 5'-UTR of TRF2 mRNA represses translation in human cells. Nucleic Acids Res 2010;38:7187–98.
- [18] Xu S, Li Q, Xiang J, Yang Q, Sun H, Guan A, et al. Thioflavin T as an efficient fluorescence sensor for selective recognition of RNA G-quadruplexes. Sci Rep 2016;6:24793.
- [19] Xu S, Li Q, Xiang J, Yang Q, Sun H, Guan A, et al. Directly lighting up RNA Gquadruplexes from test tubes to living human cells. Nucleic Acids Res 2015;43:9575–86.
- [20] Ginno PA, Lott PL, Christensen HC, Korf I, Chédin F. R-loop formation is a distinctive characteristic of unmethylated human CpG island promoters. Mol Cell 2012;45:814–25.
- [21] Chen L, Chen J-Y, Zhang X, Gu Y, Xiao R, Shao C, et al. R-ChIP Using Inactive RNase H Reveals Dynamic Coupling of R-loops with Transcriptional Pausing at Gene Promoters. Mol Cell 2017;68:745–57.
- [22] Boguslawski SJ, Smith DE, Michalak MA, Mickelson KE, Yehle CO, Patterson WL, et al. Characterization of monoclonal antibody to DNA.RNA and its application to immunodetection of hybrids. J Immunol Methods 1986;89:123–30.
- [23] Sanz LA, Chédin F. High-resolution, strand-specific R-loop mapping via S9.6based DNA-RNA immunoprecipitation and high-throughput sequencing. Nat Protoc 2019;14:1734–55.
- [24] Wulfridge P, Sarma K. A nuclease- and bisulfite-based strategy captures strand-specific R-loops genome-wide. Elife 2021;10. <u>https://doi.org/10.7554/ elife.65146.</u>
- [25] Yan Q, Shields EJ, Bonasio R, Sarma K. Mapping Native R-Loops Genome-wide Using a Targeted Nuclease Approach. Cell Rep 2019;29:1369–80.
- [26] Muniz L, Nicolas E, Trouche D. RNA polymerase II speed: a key player in controlling and adapting transcriptome composition. EMBO J 2021;40: e105740.
- [27] Churchman LS, Weissman JS. Nascent transcript sequencing visualizes transcription at nucleotide resolution. Nature 2011;469:368–73.
- [28] Bintu L, Ishibashi T, Dangkulwanich M, Wu Y-Y, Lubkowska L, Kashlev M, et al. Nucleosomal elements that control the topography of the barrier to transcription. Cell 2012;151:738–49.
- [29] Sun L, Fazal FM, Li P, Broughton JP, Lee B, Tang L, et al. RNA structure maps across mammalian cellular compartments. Nat Struct Mol Biol 2019;26:322–30.
- [30] Saldi T, Fong N, Bentley DL. Transcription elongation rate affects nascent histone pre-mRNA folding and 3' end processing. Genes Dev 2018;32:297–308. <u>https://doi.org/10.1101/gad.310896.117</u>.
- [31] Zhang J, Landick R. A Two-Way Street: Regulatory Interplay between RNA Polymerase and Nascent RNA Structure. Trends Biochem Sci 2016;41:293–310.
- [32] Turowski TW, Petfalski E, Goddard BD, French SL, Helwak A, Tollervey D. Nascent Transcript Folding Plays a Major Role in Determining RNA Polymerase Elongation Rates. Mol Cell 2020;79:488–503.e11.
- [33] Saldi T, Riemondy K, Erickson B, Bentley DL. Alternative RNA structures formed during transcription depend on elongation rate and modify RNA processing. Mol Cell 2021;81:1789–801.
- [34] Wang ET, Sandberg R, Luo S, Khrebtukova I, Zhang L, Mayr C, et al. Alternative isoform regulation in human tissue transcriptomes. Nature 2008;456:470–6.
- [35] Pan Q, Shai O, Lee LJ, Frey BJ, Blencowe BJ. Deep surveying of alternative splicing complexity in the human transcriptome by high-throughput sequencing. Nat Genet 2008;40:1413–5. <u>https://doi.org/10.1038/ng.259</u>.
 [36] Vargas DY, Shah K, Batish M, Levandoski M, Sinha S, Marras SAE, et al. Single-
- [36] Vargas DY, Shah K, Batish M, Levandoski M, Sinha S, Marras SAE, et al. Singlemolecule imaging of transcriptionally coupled and uncoupled splicing. Cell 2011;147:1054–65.
- [37] Keren H, Lev-Maor G, Ast G. Alternative splicing and evolution: diversification, exon definition and function. Nat Rev Genet 2010;11:345–55.
- [38] Irimia M, Blencowe BJ. Alternative splicing: decoding an expansive regulatory laver. Curr Onin Cell Biol 2012;24:323–32.
- [39] Kalsotra A, Cooper TA. Functional consequences of developmentally regulated alternative splicing. Nat Rev Genet 2011;12:715–29.
- [40] Bell LR, Maine EM, Schedl P, Cline TW. Sex-lethal, a Drosophila sex determination switch gene, exhibits sex-specific RNA splicing and sequence similarity to RNA binding proteins. Cell 1988;55:1037–46.
- [41] Scotti MM, Swanson MS. RNA mis-splicing in disease. Nat Rev Genet 2016;17:19–32.
- [42] Feng D, Xie J. Aberrant splicing in neurological diseases. Wiley Interdiscip Rev RNA 2013;4:631–49.
- [43] Bonnal SC, López-Oreja I, Valcárcel J. Roles and mechanisms of alternative splicing in cancer – implications for care. Nat Rev Clin Oncol 2020;17:457–74. <u>https://doi.org/10.1038/s41571-020-0350-x</u>.
- [44] Jaganathan K, Kyriazopoulou Panagiotopoulou S, McRae JF, Darbandi SF, Knowles D, Li YI, et al. Predicting Splicing from Primary Sequence with Deep Learning. Cell 2019;176:535–48.

- [45] Rentzsch P, Schubach M, Shendure J, Kircher M. CADD-Splice-improving genome-wide variant effect prediction using deep learning-derived splice scores. Genome Med 2021;13. <u>https://doi.org/10.1186/s13073-021-00835-9</u>.
- [46] Barash Y, Calarco JA, Gao W, Pan Q, Wang X, Shai O, et al. Deciphering the splicing code. Nature 2010;465:53–9.
- [47] Schärfen L, Neugebauer KM. Transcription Regulation Through Nascent RNA Folding. J Mol Biol 2021;433:166975.
- [48] Lai D, Proctor JR, Meyer IM. On the importance of cotranscriptional RNA structure formation. RNA 2013;19:1461–73.
- [49] Kalinina M, Skvortsov D, Kalmykova S, Ivanov T, Dontsova O, Pervouchine DD. Multiple competing RNA structures dynamically control alternative splicing in the human ATE1 gene. Nucleic Acids Res 2021;49:479–90.
- [50] Fong N, Kim H, Zhou Y, Ji X, Qiu J, Saldi T, et al. Pre-mRNA splicing is facilitated by an optimal RNA polymerase II elongation rate. Genes Dev 2014;28:2663–76. <u>https://doi.org/10.1101/gad.252106.114</u>.
- [51] Gerstberger S, Hafner M, Tuschl T. A census of human RNA-binding proteins. Nat Rev Genet 2014;15:829–45.
- [52] Hiller M, Zhang Z, Backofen R, Stamm S. Pre-mRNA secondary structures influence exon recognition. PLoS Genet 2007;3:e204.
- [53] Maris C, Dominguez C, Allain F-H-T. The RNA recognition motif, a plastic RNA-binding platform to regulate post-transcriptional gene expression. FEBS J 2005;272:2118–31.
- [54] Taliaferro JM, Lambert NJ, Sudmant PH, Dominguez D, Merkin JJ, Alexis MS, et al. RNA Sequence Context Effects Measured In Vitro Predict In Vivo Protein Binding and Regulation. Mol Cell 2016;64:294–306.
- [55] Li X, Quon G, Lipshitz HD, Morris Q. Predicting in vivo binding sites of RNA-binding proteins using mRNA secondary structure. RNA 2010;16:1096–107.
- [56] Jin Y, Yang Y, Zhang P. New insights into RNA secondary structure in the alternative splicing of pre-mRNAs. RNA Biol 2011;8:450–7.
- [57] Shepard PJ, Hertel KJ. Conserved RNA secondary structures promote alternative splicing. RNA 2008;14:1463–9.
- [58] Buratti E, Baralle FE. Influence of RNA secondary structure on the pre-mRNA splicing process. Mol Cell Biol 2004;24:10505–14.
- [59] McManus CJ, Graveley BR. RNA structure and the mechanisms of alternative splicing. Curr Opin Genet Dev 2011;21:373–9.
- [60] Shi H, Hoffman BE, Lis JT. A specific RNA hairpin loop structure binds the RNA recognition motifs of the Drosophila SR protein B52. Mol Cell Biol 1997;17:2649–57. <u>https://doi.org/10.1128/mcb.17.5.2649</u>.
- [61] Saha K, England W, Fernandez MM, Biswas T, Spitale RC, Ghosh G. Structural disruption of exonic stem-loops immediately upstream of the intron regulates mammalian splicing. Nucleic Acids Res 2020;48:6294–309.
- [62] Hertel KJ. Combinatorial control of exon recognition. J Biol Chem 2008;283:1211–5.
- [63] Warf MB, Diegel JV, von Hippel PH, Berglund JA. The protein factors MBNL1 and U2AF65 bind alternative RNA structures to regulate splicing. Proc Natl Acad Sci U S A 2009;106:9203–8.
- [64] Warf MB, Berglund JA. MBNL binds similar RNA structures in the CUG repeats of myotonic dystrophy and its pre-mRNA substrate cardiac troponin T. RNA 2007;13:2238–51.
- [65] Lee ASY, Kranzusch PJ, Cate JHD. eIF3 targets cell-proliferation messenger RNAs for translational activation or repression. Nature 2015;522:111–4.
- [66] Benhalevy D, Gupta SK, Danan CH, Ghosal S, Sun H-W, Kazemier HG, et al. The Human CCHC-type Zinc Finger Nucleic Acid-Binding Protein Binds G-Rich Elements in Target mRNA Coding Sequences and Promotes Translation. Cell Rep 2017;18:2979–90.
- [67] Goering R, Hudish LI, Guzman BB, Raj N, Bassell GJ, Russ HA, et al. FMRP promotes RNA localization to neuronal projections through interactions between its RGG domain and G-quadruplex RNA sequences. Elife 2020;9. https://doi.org/10.7554/eLife.52621.
- [68] Fukunaga T, Ozaki H, Terai G, Asai K, Iwasaki W, Kiryu H. CapR: revealing structural specificities of RNA-binding protein target recognition using CLIPseq data. Genome Biol 2014;15:R16.
- [69] Maticzka D, Lange SJ, Costa F, Backofen R. GraphProt: modeling binding preferences of RNA-binding proteins. Genome Biol 2014;15:R17.
- [70] Lee DSM, Ghanem LR, Barash Y. Integrative analysis reveals RNA Gquadruplexes in UTRs are selectively constrained and enriched for functional associations. Nat Commun 2020;11:527.
- [71] Marintchev A, Edmonds KA, Marintcheva B, Hendrickson E, Oberer M, Suzuki C, et al. Topology and regulation of the human elF4A/4G/4H helicase complex in translation initiation. Cell 2009;136:447–60.
- [72] Pisareva VP, Pisarev AV, Komar AA, Hellen CUT, Pestova TV. Translation Initiation on Mammalian mRNAs with Structured 5'UTRs Requires DExH-Box Protein DHX29. Cell 2008;135:1237–50. <u>https://doi.org/10.1016/ i.cell.2008.10.037</u>.
- [73] Chakraborty P, Grosse F. Human DHX9 helicase preferentially unwinds RNAcontaining displacement loops (R-loops) and G-quadruplexes. DNA Repair 2011;10:654–65. <u>https://doi.org/10.1016/j.dnarep.2011.04.013</u>.
- [74] Gulliver C, Hoffmann R, Baillie GS. The enigmatic helicase DHX9 and its association with the hallmarks of cancer. Future Sci OA 2020;7:FSO650.
- [75] Serikawa T, Spanos C, von Hacht A, Budisa N, Rappsilber J, Kurreck J. Comprehensive identification of proteins binding to RNA G-quadruplex motifs in the 5' UTR of tumor-associated mRNAs. Biochimie 2018;144:169–84.
- [76] Fay MM, Lyons SM, Ivanov P. RNA G-Quadruplexes in Biology: Principles and Molecular Mechanisms. J Mol Biol 2017;429:2127–47.

- [77] Chen MC, Tippana R, Demeshkina NA, Murat P, Balasubramanian S, Myong S, et al. Structural basis of G-quadruplex unfolding by the DEAH/RHA helicase DHX36. Nature 2018;558:465–9.
- [78] Chen X, Yuan J, Xue G, Campanario S, Wang D, Wang W, et al. Translational control by DHX36 binding to 5'UTR G-quadruplex is essential for muscle stem-cell regenerative functions. Nat Commun 2021;12:5043.
- [79] Nie J, Jiang M, Zhang X, Tang H, Jin H, Huang X, et al. Post-transcriptional Regulation of Nkx2-5 by RHAU in Heart Development. Cell Rep 2015;13:723–32.
- [80] Murat P, Marsico G, Herdy B, Ghanbarian AT, Portella G, Balasubramanian S. RNA G-quadruplexes at upstream open reading frames cause DHX36- and DHX9-dependent translation of human mRNAs. Genome Biol 2018;19:229.
- [81] Ribeiro de Almeida C, Dhir S, Dhir A, Moghaddam AE, Sattentau Q, Meinhart A, et al. RNA Helicase DDX1 Converts RNA G-Quadruplex Structures into R-Loops to Promote IgH Class Switch Recombination. Mol Cell 2018;70:650–62.
- [82] Herdy B, Mayer C, Varshney D, Marsico G, Murat P, Taylor C, et al. Analysis of NRAS RNA G-quadruplex binding proteins reveals DDX3X as a novel interactor of cellular G-quadruplex containing transcripts. Nucleic Acids Res 2018;46:11592–604.
- [83] McRae EKS, Booy EP, Moya-Torres A, Ezzati P, Stetefeld J, McKenna SA. Human DDX21 binds and unwinds RNA guanine quadruplexes. Nucleic Acids Res 2017;45:6656–68.
- [84] Dardenne E, Polay Espinoza M, Fattet L, Germann S, Lambert M-P, Neil H, et al. RNA helicases DDX5 and DDX17 dynamically orchestrate transcription, miRNA, and splicing programs in cell differentiation. Cell Rep 2014;7:1900–13.
- [85] Fiorini F, Bagchi D, Le Hir H, Croquette V. Human Upf1 is a highly processive RNA helicase and translocase with RNP remodelling activities. Nat Commun 2015;6:7581.
- [86] Kar A, Fushimi K, Zhou X, Ray P, Shi C, Chen X, et al. RNA helicase p68 (DDX5) regulates tau exon 10 splicing by modulating a stem-loop structure at the 5' splice site. Mol Cell Biol 2011;31:1812–21.
- [87] Wu G, Xing Z, Tran EJ, Yang D. DDX5 helicase resolves G-quadruplex and is involved in gene transcriptional activation. Proc Natl Acad Sci U S A 2019;116:20453-61.
- [88] Moindrot B, Cerase A, Coker H, Masui O, Grijzenhout A, Pintacuda G, et al. A Pooled shRNA Screen Identifies Rbm15, Spen, and Wtap as Factors Required for Xist RNA-Mediated Silencing. Cell Rep 2015;12:562–72.
- [89] Van Nostrand EL, Freese P, Pratt GA, Wang X, Wei X, Xiao R, et al. A large-scale binding and functional map of human RNA-binding proteins. Nature 2020;583:711–9.
- [90] Fei T, Chen Y, Xiao T, Li W, Cato L, Zhang P, et al. Genome-wide CRISPR screen identifies HNRNPL as a prostate cancer dependency regulating RNA splicing. Proc Natl Acad Sci U S A 2017;114:E5207–15.
- [91] Wang E, Lu SX, Pastore A, Chen X, Imig J, Chun-Wei Lee S, et al. Targeting an RNA-Binding Protein Network in Acute Myeloid Leukemia. Cancer Cell 2019;35:369–84.
- [92] Bourgeois CF, Mortreux F, Auboeuf D. The multiple functions of RNA helicases as drivers and regulators of gene expression. Nat Rev Mol Cell Biol 2016;17:426–38.
- [93] Caterino M, Paeschke K. Action and function of helicases on RNA Gquadruplexes. Methods 2021. <u>https://doi.org/10.1016/i.ymeth.2021.09.003</u>.
- [94] Mendoza O, Bourdoncle A, Boulé J-B, Brosh Jr RM, Mergny J-L. G-quadruplexes and helicases. Nucleic Acids Res 2016;44:1989–2006.
- [95] Paeschke K, Capra JA, Zakian VA. DNA replication through G-quadruplex motifs is promoted by the Saccharomyces cerevisiae Pif1 DNA helicase. Cell 2011;145:678–91.
- [96] Tran PLT, Pohl TJ, Chen C-F, Chan A, Pott S, Zakian VA. PIF1 family DNA helicases suppress R-loop mediated genome instability at tRNA genes. Nat Commun 2017;8:15025.
- [97] Coin F, Oksenych V, Egly J-M. Distinct roles for the XPB/p52 and XPD/p44 subcomplexes of TFIIH in damaged DNA opening during nucleotide excision repair. Mol Cell 2007;26:245–56.
- [98] Gray LT, Vallur AC, Eddy J, Maizels N. G quadruplexes are genomewide targets of transcriptional helicases XPB and XPD. Nat Chem Biol 2014;10:313–8.
- [99] Javadekar SM, Nilavar NM, Paranjape A, Das K, Raghavan SC. Characterization of G-quadruplex antibody reveals differential specificity for G4 DNA forms. DNA Res 2020;27. <u>https://doi.org/10.1093/dnares/dsaa024</u>.
 [100] Nguyen GH, Tang W, Robles AI, Beyer RP, Gray LT, Welsh JA, et al. Regulation
- [100] Nguyen GH, Tang W, Robles AI, Beyer RP, Gray LT, Welsh JA, et al. Regulation of gene expression by the BLM helicase correlates with the presence of Gquadruplex DNA motifs. Proc Natl Acad Sci U S A 2014;111:9905–10.
- [101] Ellis NA, Groden J, Ye TZ, Straughen J, Lennon DJ, Ciocci S, et al. The Bloom's syndrome gene product is homologous to RecQ helicases. Cell 1995;83:655–66.
- [102] van Wietmarschen N, Merzouk S, Halsema N, Spierings DCJ, Guryev V, Lansdorp PM. BLM helicase suppresses recombination at G-quadruplex motifs in transcribed genes. Nat Commun 2018;9:271.
- [103] Marabitti V, Valenzisi P, Lillo G, Malacaria E, Palermo V, Pichierri P, et al. R-Loop-Associated Genomic Instability and Implication of WRN and WRNIP1. Int J Mol Sci 2022;23. <u>https://doi.org/10.3390/ijms23031547</u>.
- [104] Fry M, Loeb LA. Human Werner Syndrome DNA Helicase Unwinds Tetrahelical Structures of the Fragile X Syndrome Repeat Sequence d(CGG) n*. J Biol Chem 1999;274:12797–802.
- [105] Tang W, Robles AI, Beyer RP, Gray LT, Nguyen GH, Oshima J, et al. The Werner syndrome RECQ helicase targets G4 DNA in human cells to modulate transcription. Hum Mol Genet 2016;25:2060–9.

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- [106] Fidaleo M, Svetoni F, Volpe E, Miñana B, Caporossi D, Paronetto MP. Genotoxic stress inhibits Ewing sarcoma cell growth by modulating alternative pre-mRNA processing of the RNA helicase DHX9. Oncotarget 2015;6:31740–57.
- [107] Cristini A, Groh M, Kristiansen MS, Gromak N. RNA/DNA Hybrid Interactome Identifies DXH9 as a Molecular Player in Transcriptional Termination and R-Loop-Associated DNA Damage. Cell Rep 2018;23:1891–905.
- [108] Jain A, Bacolla A, Chakraborty P, Grosse F, Vasquez KM. Human DHX9 helicase unwinds triple-helical DNA structures. Biochemistry 2010;49:6992–9.
- [109] Jain A, Bacolla A, Del Mundo IM, Zhao J, Wang G, Vasquez KM. DHX9 helicase is involved in preventing genomic instability induced by alternatively structured DNA in human cells. Nucleic Acids Res 2013;41:10345–57.
- [110] Aktaş T, Avşar Ilık İ, Maticzka D, Bhardwaj V, Pessoa Rodrigues C, Mittler G, et al. DHX9 suppresses RNA processing defects originating from the Alu invasion of the human genome. Nature 2017;544:115–9.
- [111] Iwamoto F, Stadler M, Chalupníková K, Oakeley E, Nagamine Y. Transcriptiondependent nucleolar cap localization and possible nuclear function of DExH RNA helicase RHAU. Exp Cell Res 2008;314:1378–91.
- [112] Huang W, Smaldino PJ, Zhang Q, Miller LD, Cao P, Stadelman K, et al. Yin Yang 1 contains G-quadruplex structures in its promoter and 5'-UTR and its expression is modulated by G4 resolvase 1. Nucleic Acids Res 2011;40:1033–49.
- [113] Sauer M, Juranek SA, Marks J, De Magis A, Kazemier HG, Hilbig D, et al. DHX36 prevents the accumulation of translationally inactive mRNAs with G4structures in untranslated regions. Nat Commun 2019;10:2421.
- [114] Liu G, Du W, Xu H, Sun Q, Tang D, Zou S, et al. RNA G-quadruplex regulates microRNA-26a biogenesis and function. J Hepatol 2020;73:371–82.
- [115] Booy EP, Meier M, Okun N, Novakowski SK, Xiong S, Stetefeld J, et al. The RNA helicase RHAU (DHX36) unwinds a G4-quadruplex in human telomerase RNA and promotes the formation of the P1 helix template boundary. Nucleic Acids Res 2012;40:4110–24.
- [116] Decorsière A, Cayrel A, Vagner S, Millevoi S. Essential role for the interaction between hnRNP H/F and a G quadruplex in maintaining p53 pre-mRNA 3'end processing and function during DNA damage. Genes Dev 2011;25:220–5.
- [117] Herviou P, Le Bras M, Dumas L, Hieblot C, Gilhodes J, Cioci G, et al. hnRNP H/F drive RNA G-quadruplex-mediated translation linked to genomic instability and therapy resistance in glioblastoma. Nat Commun 2020;11:2661.
- [118] Fukuda T, Yamagata K, Fujiyama S, Matsumoto T, Koshida I, Yoshimura K, et al. DEAD-box RNA helicase subunits of the Drosha complex are required for processing of rRNA and a subset of microRNAs. Nat Cell Biol 2007;9:604–11.
- [119] Lambert M-P, Terrone S, Giraud G, Benoit-Pilven C, Cluet D, Combaret V, et al. The RNA helicase DDX17 controls the transcriptional activity of REST and the expression of proneural microRNAs in neuronal differentiation. Nucleic Acids Res 2018;46:7686–700.
- [120] Kim D-S, Camacho CV, Nagari A, Malladi VS, Challa S, Kraus WL. Activation of PARP-1 by snoRNAs Controls Ribosome Biogenesis and Cell Growth via the RNA Helicase DDX21. Mol Cell 2019;75:1270–85.
- [121] Zhang Z, Kim T, Bao M, Facchinetti V, Jung SY, Ghaffari AA, et al. DDX1, DDX21, and DHX36 helicases form a complex with the adaptor molecule TRIF to sense dsRNA in dendritic cells. Immunity 2011;34:866–78.
- [122] Dong Y, Ye W, Yang J, Han P, Wang Y, Ye C, et al. DDX21 translocates from nucleus to cytoplasm and stimulates the innate immune response due to dengue virus infection. Biochem Biophys Res Commun 2016;473:648–53.
- [123] Sénéchal P, Robert F, Cencic R, Yanagiya A, Chu J, Sonenberg N, et al. Assessing eukaryotic initiation factor 4F subunit essentiality by CRISPR-induced gene ablation in the mouse. Cell Mol Life Sci 2021;78:6709–19.
- [124] Mosler T, Conte F, Longo GMC, Mikicic I, Kreim N, Möckel MM, et al. R-loop proximity proteomics identifies a role of DDX41 in transcription-associated genomic instability. Nat Commun 2021;12:7314.
- [125] Pérez-Calero C, Bayona-Feliu A, Xue X, Barroso SI, Muñoz S, González-Basallote VM, et al. UAP56/DDX39B is a major cotranscriptional RNA-DNA helicase that unwinds harmful R loops genome-wide. Genes Dev 2020;34:898–912.
- [126] Skourti-Stathaki K, Proudfoot NJ. A double-edged sword: R loops as threats to genome integrity and powerful regulators of gene expression. Genes Dev 2014;28:1384–96.
- [127] Skourti-Stathaki K, Proudfoot NJ, Gromak N. Human senataxin resolves RNA/ DNA hybrids formed at transcriptional pause sites to promote Xrn2dependent termination. Mol Cell 2011;42:794–805.
- [128] Hirose T, Ideue T, Nagai M, Hagiwara M, Shu M-D, Steitz JA. A spliceosomal intron binding protein, IBP160, links position-dependent assembly of intronencoded box C/D snoRNP to pre-mRNA splicing. Mol Cell 2006;23:673–84.
- [129] Sollier J, Stork CT, García-Rubio ML, Paulsen RD, Aguilera A, Cimprich KA. Transcription-coupled nucleotide excision repair factors promote R-loopinduced genome instability. Mol Cell 2014;56:777–85.
- [130] Akay A, Di Domenico T, Suen KM, Nabih A, Parada GE, Larance M, et al. The Helicase Aquarius/EMB-4 Is Required to Overcome Intronic Barriers to Allow Nuclear RNAi Pathways to Heritably Silence Transcription. Dev Cell 2017;42:241–55.
- [131] Balasubramanian S, Hurley LH, Neidle S. Targeting G-quadruplexes in gene promoters: a novel anticancer strategy? Nat Rev Drug Discov 2011;10:261–75.
- [132] Georgakopoulos-Soares I, Parada GE, Wong HY, Miska EA, Kwok CK, Hemberg M. Alternative splicing modulation by G-quadruplexes n.d. https://doi.org/ 10.1101/700575.

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- [133] Gomez D, Lemarteleur T, Lacroix L, liet P, Mergny J-L, Riou J-F. Telomerase downregulation induced by the G-quadruplex ligand 12459 in A549 cells is mediated by hTERT RNA alternative splicing. Nucleic Acids Res 2004;32:371–9.
- [134] Didiot M-C, Tian Z, Schaeffer C, Subramanian M, Mandel J-L, Moine H. The Gquartet containing FMRP binding site in FMR1 mRNA is a potent exonic splicing enhancer. Nucleic Acids Res 2008;36:4902–12.
- [135] Marcel V, Tran PLT, Sagne C, Martel-Planche G, Vaslin L, Teulade-Fichou M-P, et al. G-quadruplex structures in TP53 intron 3: role in alternative splicing and in production of p53 mRNA isoforms. Carcinogenesis 2011;32:271–8.
- [136] Ribeiro MM, Teixeira GS, Martins L, Marques MR, de Souza AP, Line SRP. Gquadruplex formation enhances splicing efficiency of PAX9 intron 1. Hum Genet 2015;134:37–44.
- [137] Huang H, Zhang J, Harvey SE, Hu X, Cheng C. RNA G-quadruplex secondary structure promotes alternative splicing via the RNA-binding protein hnRNPF. Genes Dev 2017;31:2296–309.
- [138] Bartys N, Kierzek R, Lisowiec-Wachnicka J. The regulation properties of RNA secondary structure in alternative splicing. Biochim Biophys Acta Gene Regul Mech 2019:194401.
- [139] Izumi H, Funa K. Telomere Function and the G-Quadruplex Formation are Regulated by hnRNP U. Cells 2019;8. <u>https://doi.org/10.3390/cells8050390</u>.
- [140] Zhang J, Harvey SE, Cheng C. A high-throughput screen identifies small molecule modulators of alternative splicing by targeting RNA Gquadruplexes. Nucleic Acids Res 2019;47:3667–79.
- [141] Kalmykova S, Kalinina M, Denisov S, Mironov A, Skvortsov D, Guigó R, et al. Conserved long-range base pairings are associated with pre-mRNA processing of human genes. Nat Commun 2021;12:2300.
- [142] Pervouchine DD, Khrameeva EE, Pichugina MY, Nikolaienko OV, Gelfand MS, Rubtsov PM, et al. Evidence for widespread association of mammalian splicing and conserved long-range RNA structures. RNA 2012;18:1–15.
- [143] Graveley BR. Mutually exclusive splicing of the insect Dscam pre-mRNA directed by competing intronic RNA secondary structures. Cell 2005;123:65–73.
- [144] Yang Y, Zhan L, Zhang W, Sun F, Wang W, Tian N, et al. RNA secondary structure in mutually exclusive splicing. Nat Struct Mol Biol 2011;18:159–68.
- [145] Miriami E, Margalit H, Sperling R. Conserved sequence elements associated with exon skipping. Nucleic Acids Res 2003;31:1974–83.
- [146] Howe KJ, Ares Jr M. Intron self-complementarity enforces exon inclusion in a yeast pre-mRNA. Proc Natl Acad Sci U S A 1997;94:12467–72.
- [147] Lev-Maor G, Ram O, Kim E, Sela N, Goren A, Levanon EY, et al. Intronic Alus influence alternative splicing. PLoS Genet 2008;4:e1000204.
- [148] Jeck WR, Sorrentino JA, Wang K, Slevin MK, Burd CE, Liu J, et al. Circular RNAs are abundant, conserved, and associated with ALU repeats. RNA 2013;19:141–57.
- [149] Lin C-L, Taggart AJ, Lim KH, Cygan KJ, Ferraris L, Creton R, et al. RNA structure replaces the need for U2AF2 in splicing. Genome Res 2016;26:12–23.
- [150] Lewis CJT, Pan T, Kalsotra A. RNA modifications and structures cooperate to guide RNA-protein interactions. Nat Rev Mol Cell Biol 2017;18:202–10.
- [151] Lovci MT, Ghanem D, Marr H, Arnold J, Gee S, Parra M, et al. Rbfox proteins regulate alternative mRNA splicing through evolutionarily conserved RNA bridges. Nat Struct Mol Biol 2013;20:1434–42.
- [152] Muh SJ, Hovhannisyan RH, Carstens RP. A Non-sequence-specific doublestranded RNA structural element regulates splicing of two mutually exclusive exons of fibroblast growth factor receptor 2 (FGFR2). J Biol Chem 2002;277:50143–54.
- [153] Muro AF, Caputi M, Pariyarath R, Pagani F, Buratti E, Baralle FE. Regulation of fibronectin EDA exon alternative splicing: possible role of RNA secondary structure for enhancer display. Mol Cell Biol 1999;19:2657–71.
- [154] Buratti E, Muro AF, Giombi M, Gherbassi D, Iaconcig A, Baralle FE. RNA folding affects the recruitment of SR proteins by mouse and human polypurinic enhancer elements in the fibronectin EDA exon. Mol Cell Biol 2004;24:1387–400.
- [155] Libri D, Balvay L, Fiszman MY. In vivo splicing of the beta tropomyosin premRNA: a role for branch point and donor site competition. Mol Cell Biol 1992;12:3204–15.
- [156] Higashide S, Morikawa K, Okumura M, Kondo S, Ogata M, Murakami T, et al. Identification of regulatory cis-acting elements for alternative splicing of presenilin 2 exon 5 under hypoxic stress conditions. J Neurochem 2004;91:1191–8.
- [157] Meyer M, Plass M, Pérez-Valle J, Eyras E, Vilardell J. Deciphering 3'ss Selection in the Yeast Genome Reveals an RNA Thermosensor that Mediates Alternative Splicing. Mol Cell 2011;43:1033–9. <u>https://doi.org/10.1016/ j.molcel.2011.07.030</u>.
- [158] Wu X, Bartel DP. Widespread Influence of 3'-End Structures on Mammalian mRNA Processing and Stability. Cell 2017;169:905–17. <u>https://doi.org/ 10.1016/j.cell.2017.04.036</u>.
- [159] Mauger DM, Joseph Cabral B, Presnyak V, Su SV, Reid DW, Goodman B, et al. mRNA structure regulates protein expression through changes in functional half-life. Proc Natl Acad Sci 2019;116:24075–83. <u>https://doi.org/10.1073/ pnas.1908052116</u>.
- [160] Hia F, Yang SF, Shichino Y, Yoshinaga M, Murakawa Y, Vandenbon A, et al. Codon bias confers stability to human mRNAs. EMBO Rep 2019;20:e48220.
- [161] Agarwal V, Subtelny AO, Thiru P, Ulitsky I, Bartel DP. Predicting microRNA targeting efficacy in Drosophila. Genome Biol 2018;19:152.

- [162] Courel M, Clément Y, Bossevain C, Foretek D, Vidal Cruchez O, Yi Z, et al. GC content shapes mRNA storage and decay in human cells. Elife 2019;8. <u>https:// doi.org/10.7554/eLife.49708</u>.
- [163] Geisberg JV, Moqtaderi Z, Fan X, Ozsolak F, Struhl K. Global analysis of mRNA isoform half-lives reveals stabilizing and destabilizing elements in yeast. Cell 2014;156:812–24.
- [164] Carrier TA, Keasling JD. Engineering mRNA stability in E. coli by the addition of synthetic hairpins using a 5' cassette system. Biotechnol Bioeng 1997;55:577–80.
- [165] Siegel DA, Le Tonqueze O, Biton A, Zaitlen N, Erle DJ. Massively Parallel Analysis of Human 3' UTRs Reveals that AU-Rich Element Length and Registration Predict mRNA Destabilization n.d. https://doi.org/10.1101/ 2020.02.12.945063.
- [166] Kertesz M, Iovino N, Unnerstall U, Gaul U, Segal E. The role of site accessibility in microRNA target recognition. Nat Genet 2007;39:1278–84.
- [167] Carrier TA, Keasling JD. Controlling messenger RNA stability in bacteria: strategies for engineering gene expression. Biotechnol Prog 1997;13:699–708.
- [168] Carrier T, Jones KL, Keasling JD. mRNA stability and plasmid copy number effects on gene expression from an inducible promoter system. Biotechnol Bioeng 1998;59:666–72.
- [169] Leppek K, Schott J, Reitter S, Poetz F, Hammond MC, Stoecklin G. Roquin Promotes Constitutive mRNA Decay via a Conserved Class of Stem-Loop Recognition Motifs. Cell 2013;153:869–81. <u>https://doi.org/10.1016/</u> i.cell.2013.04.016.
- [170] Codutti L, Leppek K, Zálešák J, Windeisen V, Masiewicz P, Stoecklin G, et al. A Distinct, Sequence-Induced Conformation Is Required for Recognition of the Constitutive Decay Element RNA by Roquin. Structure 2015;23:1437–47.
- [171] Inoue F, Ahituv N. Decoding enhancers using massively parallel reporter assays. Genomics 2015;106:159–64.
- [172] Gordon MG, Inoue F, Martin B, Schubach M, Agarwal V, Whalen S, et al. lentiMPRA and MPRAflow for high-throughput functional characterization of gene regulatory elements. Nat Protoc 2020;15:2387–412.
- [173] Georgakopoulos-Soares I, Jain N, Gray JM, Hemberg M. MPRAnator: a webbased tool for the design of massively parallel reporter assay experiments. Bioinformatics 2017;33:137–8.
- [174] Ashuach T, Fischer DS, Kreimer A, Ahituv N, Theis FJ, Yosef N. MPRAnalyze: statistical framework for massively parallel reporter assays. Genome Biol 2019;20:183.
- [175] Hershey JWB, Sonenberg N, Mathews MB. Principles of translational control: an overview. Cold Spring Harb Perspect Biol 2012;4. <u>https://doi.org/10.1101/ cshperspect.a011528</u>.
- [176] Ingolia NT, Hussmann JA, Weissman JS. Ribosome Profiling: Global Views of Translation. Cold Spring Harb Perspect Biol 2019;11. <u>https://doi.org/10.1101/ cshperspect.a032698</u>.
- [177] Sonenberg N, Hinnebusch AG. Regulation of translation initiation in eukaryotes: mechanisms and biological targets. Cell 2009;136:731–45.
- [178] Silvera D, Formenti SC, Schneider RJ. Translational control in cancer. Nat Rev Cancer 2010;10:254–66.
- [179] Shirokikh NE, Preiss T. Translation initiation by cap-dependent ribosome recruitment: Recent insights and open questions. WIREs RNA 2018;9. https://doi.org/10.1002/wrna.1473.
- [180] Gebauer F, Hentze MW. Molecular mechanisms of translational control. Nat Rev Mol Cell Biol 2004;5:827–35.
- [181] Hinnebusch AG. The Scanning Mechanism of Eukaryotic Translation Initiation. Annu Rev Biochem 2014;83:779–812. <u>https://doi.org/10.1146/</u> annurev-biochem-060713-035802.
- [182] Kwan T, Thompson SR. Noncanonical Translation Initiation in Eukaryotes. Cold Spring Harbor Perspect Biol 2019;11: <u>https://doi.org/10.1101/</u> <u>cshperspect.a032672</u>a032672.
- [183] Lozano G, Martínez-Salas E. Structural insights into viral IRES-dependent translation mechanisms. Curr Opin Virol 2015;12:113–20.
- [184] Dvir S, Velten L, Sharon E, Zeevi D, Carey LB, Weinberger A, et al. Deciphering the rules by which 5'-UTR sequences affect protein expression in yeast. Proc Natl Acad Sci U S A 2013;110:E2792–801.
- [185] Lamping E, Niimi M, Cannon RD. Small, synthetic, GC-rich mRNA stem-loop modules 5' proximal to the AUG start-codon predictably tune gene expression in yeast. Microb Cell Fact 2013;12:74. <u>https://doi.org/10.1186/1475-2859-12-74</u>.
- [186] Pelletier J, Sonenberg N. Insertion mutagenesis to increase secondary structure within the 5' noncoding region of a eukaryotic mRNA reduces translational efficiency. Cell 1985;40:515–26.
- [187] Beaudoin J-D, Novoa EM, Vejnar CE, Yartseva V, Takacs CM, Kellis M, et al. Analyses of mRNA structure dynamics identify embryonic gene regulatory programs. Nat Struct Mol Biol 2018;25:677–86.
- [188] Shah P, Ding Y, Niemczyk M, Kudla G, Plotkin JB. Rate-limiting steps in yeast protein translation. Cell 2013;153:1589–601.
- [189] Yu C-H, Dang Y, Zhou Z, Wu C, Zhao F, Sachs MS, et al. Codon Usage Influences the Local Rate of Translation Elongation to Regulate Co-translational Protein Folding. Mol Cell 2015;59:744–54.
- [190] Kozak M. Regulation of translation via mRNA structure in prokaryotes and eukaryotes. Gene 2005;361:13–37.
- [191] Gu W, Zhou T, Wilke CO. A universal trend of reduced mRNA stability near the translation-initiation site in prokaryotes and eukaryotes. PLoS Comput Biol 2010;6:e1000664.
- [192] Araujo PR, Yoon K, Ko D, Smith AD, Qiao M, Suresh U, et al. Before It Gets Started: Regulating Translation at the 5' UTR. Comp Funct Genomics 2012;2012:1-8. <u>https://doi.org/10.1155/2012/475731</u>.

- [193] Zu T, Gibbens B, Doty NS, Gomes-Pereira M, Huguet A, Stone MD, et al. Non-ATG-initiated translation directed by microsatellite expansions. Proc Natl Acad Sci 2011;108:260–5. <u>https://doi.org/10.1073/pnas.1013343108</u>.
- [194] Rogozin IB, Kochetov AV, Kondrashov FA, Koonin EV, Milanesi L. Presence of ATG triplets in 5' untranslated regions of eukaryotic cDNAs correlates with a "weak" context of the start codon. Bioinformatics 2001;17:890–900.
- [195] Kochetov AV, Sarai A, Rogozin IB, Shumny VK, Kolchanov NA. The role of alternative translation start sites in the generation of human protein diversity. Mol Genet Genomics 2005;273:491–6.
- [196] Dominguez D, Freese P, Alexis MS, Su A, Hochman M, Palden T, et al. Sequence, Structure, and Context Preferences of Human RNA Binding Proteins. Mol Cell 2018;70:854–67.
- [197] Kozak M. Circumstances and mechanisms of inhibition of translation by secondary structure in eucaryotic mRNAs. Mol Cell Biol 1989;9:5134–42.
- [198] Honda M, Brown EA, Lemon SM. Stability of a stem-loop involving the initiator AUG controls the efficiency of internal initiation of translation on hepatitis C virus RNA. RNA 1996;2:955–68.
- [199] Fernández N, Fernandez-Miragall O, Ramajo J, García-Sacristán A, Bellora N, Eyras E, et al. Structural basis for the biological relevance of the invariant apical stem in IRES-mediated translation. Nucleic Acids Res 2011;39:8572–85.
- [200] Komar AA, Hatzoglou M. Cellular IRES-mediated translation. Cell Cycle 2011;10:229-40. <u>https://doi.org/10.4161/cc.10.2.14472</u>.
- [201] Serganov A, Nudler E. A Decade of Riboswitches Cell 2013;152:17-24. https://doi.org/10.1016/i.cell.2012.12.024.
- [202] Winkler W, Nahvi A, Breaker RR. Thiamine derivatives bind messenger RNAs directly to regulate bacterial gene expression. Nature 2002;419:952–6.
- [203] Caron M-P, Bastet L, Lussier A, Simoneau-Roy M, Massé E, Lafontaine DA. Dual-acting riboswitch control of translation initiation and mRNA decay. Proc Natl Acad Sci U S A 2012;109:E3444–53.
- [204] Hollands K, Proshkin S, Sklyarova S, Epshtein V, Mironov A, Nudler E, et al. Riboswitch control of Rho-dependent transcription termination. Proc Natl Acad Sci U S A 2012;109:5376–81.
- [205] Li S, Breaker RR. Eukaryotic TPP riboswitch regulation of alternative splicing involving long-distance base pairing. Nucleic Acids Res 2013;41:3022–31.
- [206] Cheah MT, Wachter A, Sudarsan N, Breaker RR. Control of alternative RNA splicing and gene expression by eukaryotic riboswitches. Nature 2007;447:497-500.
- [207] Babendure JR, Babendure JL, Ding J-H, Tsien RY. Control of mammalian translation by mRNA structure near caps. RNA 2006;12:851–61.
- [208] Sobczak K, Krzyzosiak WJ. Structural determinants of BRCA1 translational regulation. J Biol Chem 2002;277:17349–58.
- [209] Buccitelli C, Selbach M. mRNAs, proteins and the emerging principles of gene expression control. Nat Rev Genet 2020;21:630–44.
- [210] Kozak M. Influences of mRNA secondary structure on initiation by eukaryotic ribosomes. Proc Natl Acad Sci U S A 1986;83:2850–4.
- [211] Kozak M. Downstream secondary structure facilitates recognition of initiator codons by eukaryotic ribosomes. Proc Natl Acad Sci U S A 1990;87:8301–5.
- [212] Kozak M. Context effects and inefficient initiation at non-AUG codons in eucaryotic cell-free translation systems. Mol Cell Biol 1989;9:5073–80.
- [213] Vega Laso MR, Zhu D, Sagliocco F, Brown AJ, Tuite MF, McCarthy JE. Inhibition of translational initiation in the yeast Saccharomyces cerevisiae as a function of the stability and position of hairpin structures in the mRNA leader. J Biol Chem 1993;268:6453–62.
- [214] Thomson AM, Rogers JT, Leedman PJ. Iron-regulatory proteins, ironresponsive elements and ferritin mRNA translation. Int J Biochem Cell Biol 1999;31:1139–52.
- [215] Walker MJ, Shortridge MD, Albin DD, Cominsky LY, Varani G. Structure of the RNA Specialized Translation Initiation Element that Recruits eIF3 to the 5'-UTR of c-Jun. J Mol Biol 2020;432:1841–55. <u>https://doi.org/10.1016/j. imb.2020.01.001</u>.
- [216] Cuperus JT, Groves B, Kuchina A, Rosenberg AB, Jojic N, Fields S, et al. Deep learning of the regulatory grammar of yeast 5' untranslated regions from 500,000 random sequences. Genome Res 2017;27:2015–24.
- [217] Huppert JL, Bugaut A, Kumari S, Balasubramanian S. G-quadruplexes: the beginning and end of UTRs. Nucleic Acids Res 2008;36:6260–8.
- [218] Halder K, Wieland M, Hartig JS. Predictable suppression of gene expression by 5'-UTR-based RNA quadruplexes. Nucleic Acids Res 2009;37:6811-7.
- [219] Kumari S, Bugaut A, Huppert JL, Balasubramanian S. An RNA G-quadruplex in the 5' UTR of the NRAS proto-oncogene modulates translation. Nat Chem Biol 2007;3:218–21.
- [220] Blice-Baum AC, Mihailescu M-R. Biophysical characterization of Gquadruplex forming FMR1 mRNA and of its interactions with different fragile X mental retardation protein isoforms. RNA 2014;20:103–14.
- [221] Morris MJ, Basu S. An unusually stable G-quadruplex within the 5'-UTR of the MT3 matrix metalloproteinase mRNA represses translation in eukaryotic cells. Biochemistry 2009;48:5313–9.
- [222] Arora A, Dutkiewicz M, Scaria V, Hariharan M, Maiti S, Kurreck J. Inhibition of translation in living eukaryotic cells by an RNA G-quadruplex motif. RNA 2008;14:1290–6.
- [223] Shahid R, Bugaut A, Balasubramanian S. The BCL-2 5' untranslated region contains an RNA G-quadruplex-forming motif that modulates protein expression. Biochemistry 2010;49:8300–6.
- [224] Agarwal T, Jayaraj G, Pandey SP, Agarwala P, Maiti S. RNA G-quadruplexes: Gquadruplexes with "U" turns. Curr Pharm Des 2012;18:2102–11.

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- [225] Bonnal S, Schaeffer C, Créancier L, Clamens S, Moine H, Prats A-C, et al. A Single Internal Ribosome Entry Site Containing a G Quartet RNA Structure Drives Fibroblast Growth Factor 2 Gene Expression at Four Alternative Translation Initiation Codons. J Biol Chem 2003;278:39330–6. <u>https://doi. org/10.1074/jbc.m305580200</u>.
- [226] Koukouraki P, Doxakis E. Constitutive translation of human α-synuclein is mediated by the 5'-untranslated region. Open Biol 2016;6:160022.
- [227] Morris MJ, Negishi Y, Pazsint C, Schonhoft JD, Basu S. An RNA G-quadruplex is essential for cap-independent translation initiation in human VEGF IRES. J Am Chem Soc 2010;132:17831–9.
- [228] Schaeffer C, Bardoni B, Mandel JL, Ehresmann B, Ehresmann C, Moine H. The fragile X mental retardation protein binds specifically to its mRNA via a purine quartet motif. EMBO J 2001;20:4803–13.
- [229] Bhattacharyya D, Diamond P, Basu S. An Independently folding RNA Gquadruplex domain directly recruits the 40S ribosomal subunit. Biochemistry 2015;54:1879–85.
- [230] Niu K, Zhang X, Song Q, Feng Q. G-Quadruplex Regulation of mRNA Translation by RBM4. Int J Mol Sci 2022;23. <u>https://doi.org/10.3390/ ijms23020743</u>.
- [231] Cammas A, Dubrac A, Morel B, Lamaa A, Touriol C, Teulade-Fichou M-P, et al. Stabilization of the G-quadruplex at the VEGF IRES represses capindependent translation. RNA Biol 2015;12:320–9.
- [232] Hu X-X, Wang S-Q, Gan S-Q, Liu L, Zhong M-Q, Jia M-H, et al. A Small Ligand That Selectively Binds to the G-quadruplex at the Human Vascular Endothelial Growth Factor Internal Ribosomal Entry Site and Represses the Translation. Front Chem 2021;9:781198.
- [233] Jia L, Mao Y, Ji Q, Dersh D, Yewdell JW, Qian S-B. Decoding mRNA translatability and stability from the 5' UTR. Nat Struct Mol Biol 2020;27:814–21.
- [234] Jackson RJ, Hellen CUT, Pestova TV. The mechanism of eukaryotic translation initiation and principles of its regulation. Nat Rev Mol Cell Biol 2010;11:113–27.
- [235] Georgakopoulos-Soares I, Morganella S, Jain N, Hemberg M, Nik-Zainal S. Noncanonical secondary structures arising from non-B DNA motifs are determinants of mutagenesis. Genome Res 2018;28:1264–71.
- [236] Georgakopoulos-Soares I, Victorino J, Parada GE, Agarwal V, Zhao J, Wong HY, et al. High-throughput characterization of the role of non-B DNA motifs on promoter function. Cell Genomics 2022;2:. <u>https://doi.org/10.1016/j. xgen.2022.100111</u>100111.
- [237] Gan W, Guan Z, Liu J, Gui T, Shen K, Manley JL, et al. R-loop-mediated genomic instability is caused by impairment of replication fork progression. Genes Dev 2011;25:2041–56.
- [238] García-Muse T, Aguilera A. R Loops: From Physiological to Pathological Roles. Cell 2019;179:604–18.
- [239] Bonnet A, Grosso AR, Elkaoutari A, Coleno E, Presle A, Sridhara SC, et al. Introns Protect Eukaryotic Genomes from Transcription-Associated Genetic Instability. Mol Cell 2017;67:608–21.
- [240] Petermann E, Lan L, Zou L. Sources, resolution and physiological relevance of R-loops and RNA-DNA hybrids. Nat Rev Mol Cell Biol 2022. <u>https://doi.org/ 10.1038/s41580-022-00474-x.</u>
- [241] Li X, Manley JL. Inactivation of the SR protein splicing factor ASF/SF2 results in genomic instability. Cell 2005;122:365–78.
- [242] Nguyen HD, Zou L, Graubert TA. Targeting R-loop-associated ATR response in myelodysplastic syndrome. Oncotarget 2019;10:2581–2.
- [243] Nguyen HD, Leong WY, Li W, Reddy PNG, Sullivan JD, Walter MJ, et al. Spliceosome Mutations Induce R Loop-Associated Sensitivity to ATR Inhibition in Myelodysplastic Syndromes. Cancer Res 2018;78:5363–74.
- [244] Liu F, Gong C-X. Tau exon 10 alternative splicing and tauopathies. Mol Neurodegener 2008;3:1–10.
- [245] Donahue CP, Muratore C, Wu JY, Kosik KS, Wolfe MS. Stabilization of the tau exon 10 stem loop alters pre-mRNA splicing. J Biol Chem 2006;281:23302–6.
- [246] Rogers JT, Randall JD, Cahill CM, Eder PS, Huang X, Gunshin H, et al. An iron-responsive element type II in the 5'-untranslated region of the Alzheimer's amyloid precursor protein transcript. J Biol Chem 2002;277:45518–28.
 [247] Friedlich AL, Tanzi RE, Rogers JT. The 5'-untranslated region of Parkinson's
- [247] Friedlich AL, Tanzi RE, Rogers JT. The 5'-untranslated region of Parkinson's disease alpha-synuclein messengerRNA contains a predicted iron responsive element. Mol Psychiatry 2007;12:222–3.

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- [248] Garcia-Lopez A, Tessaro F, Jonker HRA, Wacker A, Richter C, Comte A, et al. Targeting RNA structure in SMN2 reverses spinal muscular atrophy molecular phenotypes. Nat Commun 2018;9:2032.
- [249] Sulovari A, Li R, Audano PA, Porubsky D, Vollger MR, Logsdon GA, et al. Human-specific tandem repeat expansion and differential gene expression during primate evolution. Proc Natl Acad Sci U S A 2019;116:23243–53.
- [250] Georgakopoulos-Soares I, Chartoumpekis DV, Kyriazopoulou V, Zaravinos A. EMT Factors and Metabolic Pathways in Cancer. Front Oncol 2020;10:499.
- [251] Svitkin YV, Pause A, Haghighat A, Pyronnet S, Witherell G, Belsham GJ, et al. The requirement for eukaryotic initiation factor 4A (elF4A) in translation is in direct proportion to the degree of mRNA 5' secondary structure. RNA 2001;7:382–94.
- [252] Wolfe AL, Singh K, Zhong Y, Drewe P, Rajasekhar VK, Sanghvi VR, et al. RNA Gquadruplexes cause eIF4A-dependent oncogene translation in cancer. Nature 2014;513:65–70.
- [253] Green KM, Glineburg MR, Kearse MG, Flores BN, Linsalata AE, Fedak SJ, et al. RAN translation at C9orf72-associated repeat expansions is selectively enhanced by the integrated stress response. Nat Commun 2017;8:2005.
- [254] Haeusler AR, Donnelly CJ, Periz G, Simko EAJ, Shaw PG, Kim M-S, et al. C9orf72 nucleotide repeat structures initiate molecular cascades of disease. Nature 2014;507:195–200.
- [255] Reddy K, Zamiri B, Stanley SYR, Macgregor Jr RB, Pearson CE. The diseaseassociated r(GGGGCC)n repeat from the C9orf72 gene forms tract lengthdependent uni- and multimolecular RNA G-quadruplex structures. J Biol Chem 2013;288:9860–6.
- [256] Fratta P, Mizielinska S, Nicoll AJ, Zloh M, Fisher EMC, Parkinson G, et al. C9orf72 hexanucleotide repeat associated with amyotrophic lateral sclerosis and frontotemporal dementia forms RNA G-quadruplexes. Sci Rep 2012;2:1016.
- [257] Gitler AD, Tsuiji H. There has been an awakening: Emerging mechanisms of C9orf72 mutations in FTD/ALS. Brain Res 2016;1647:19–29.
- [258] Liu H, Lu Y-N, Paul T, Periz G, Banco MT, Ferré-D'Amaré AR, et al. A Helicase Unwinds Hexanucleotide Repeat RNA G-Quadruplexes and Facilitates Repeat-Associated Non-AUG Translation. J Am Chem Soc 2021;143:7368-79. <u>https://doi.org/10.1021/jacs.1c00131</u>.
- [259] Ishiguro A, Kimura N, Noma T, Shimo-Kon R, Ishihama A, Kon T. Molecular dissection of ALS-linked TDP-43 – Involvement of the Gly-rich domain in interaction with G-quadruplex mRNA. FEBS Lett 2020;594:2254–65.
- [260] Liu X, Xu Y. HnRNPA1 Specifically Recognizes the Base of Nucleotide at the Loop of RNA G-Quadruplex. Molecules 2018;23. <u>https://doi.org/ 10.3390/molecules23010237</u>.
- [261] Scalabrin M, Frasson I, Ruggiero E, Perrone R, Tosoni E, Lago S, et al. The cellular protein hnRNP A2/B1 enhances HIV-1 transcription by unfolding LTR promoter G-quadruplexes. Sci Rep 2017;7. <u>https://doi.org/10.1038/srep45244</u>.
- [262] Mori K, Lammich S, Mackenzie IRA, Forné I, Zilow S, Kretzschmar H, et al. hnRNP A3 binds to GGGGCC repeats and is a constituent of p62-positive/ TDP43-negative inclusions in the hippocampus of patients with C9orf72 mutations. Acta Neuropathol 2013;125:413–23.
- [263] Takahama K, Kino K, Arai S, Kurokawa R, Oyoshi T. Identification of Ewing's sarcoma protein as a G-quadruplex DNA- and RNA-binding protein. FEBS J 2011;278:988–98. <u>https://doi.org/10.1111/j.1742-4658.2011.08020.x</u>.
- [264] Zamiri B, Reddy K, Macgregor Jr RB, Pearson CE. TMPyP4 porphyrin distorts RNA G-quadruplex structures of the disease-associated r(GGGGCC)n repeat of the C9orf72 gene and blocks interaction of RNA-binding proteins. J Biol Chem 2014;289:4653–9.
- [265] Simone R, Balendra R, Moens TG, Preza E, Wilson KM, Heslegrave A, et al. Gquadruplex-binding small molecules ameliorate FTD/ALS pathology and. EMBO Mol Med 2018;10:22–31.
- [266] Masters CL, Bateman R, Blennow K, Rowe CC, Sperling RA, Cummings JL. Alzheimer's disease. Nat Rev Dis Primers 2015;1. <u>https://doi.org/10.1038/ nrdp.2015.56</u>.
- [267] Fisette J-F, Montagna DR, Mihailescu M-R, Wolfe MS. A G-rich element forms a G-quadruplex and regulates BACE1 mRNA alternative splicing. J Neurochem 2012;121:763–73.
- [268] Lammich S, Kamp F, Wagner J, Nuscher B, Zilow S, Ludwig A-K, et al. Translational repression of the disintegrin and metalloprotease ADAM10 by a stable G-quadruplex secondary structure in its 5'-untranslated region. J Biol Chem 2011;286:45063–72.