



ANDSTRUCTURAL BIOTECHNOLOGY JOURNAL



journal homepage: www.elsevier.com/locate/csbj

Biomotors, viral assembly, and RNA nanobiotechnology: Current achievements and future directions



Lewis Rolband^{a,1}, Damian Beasock^{a,1}, Yang Wang^b, Yao-Gen Shu^b, Jonathan D. Dinman^c, Tamar Schlick^d, Yaoqi Zhou^e, Jeffrey S. Kieft^f, Shi-Jie Chen^g, Giovanni Bussi^h, Abdelghani Oukhaledⁱ, Xingfa Gao^j, Petr Šulc^k, Daniel Binzel¹, Abhjeet S. Bhullar¹, Chenxi Liang¹, Peixuan Guo^{1,*}, Kirill A. Afonin^{a,*}

^a University of North Carolina at Charlotte, Charlotte, NC 28223, USA

^b Wenzhou Institute, University of China Academy of Sciences, 1st, Jinlian Road, Longwan District, Wenzhou, Zhjiang 325001, China

^c University of Maryland, College Park, MD 20742, USA

^d New York University, Department of Chemistry and Courant Institute of Mathematical Sciences, Simons Center for Computational Physical Chemistry, New York, NY 10012, USA ^e Institute for Systems and Physical Biology, Shenzhen Bay Laboratory, Shenzhen, Guangdong 518107, China

^fUniversity of Colorado Anschutz Medical Campus, Aurora, CO 80045, USA

^g University of Missouri at Columbia, Columbia, MO 65211, USA

^h Scuola Internazionale Superiore di Studi Avanzati, via Bonomea 265, 34136 Trieste, Italy

ⁱCY Cergy Paris Université, CNRS, LAMBE, Cergy, France

^jNational Center for Nanoscience and Technology of China, Beijing 100190, China

^kArizona State University. Tempe, AZ, USA

Anzona State University, Tempe, AZ, USA

¹The Ohio State University, Columbus, OH 43210, USA

ARTICLE INFO

Article history: Received 1 September 2022 Received in revised form 4 November 2022 Accepted 4 November 2022 Available online 11 November 2022

Keywords: ISRNN RNA nanotechnology Biomotors Therapies Drug delivery Virus assembly

ABSTRACT

The International Society of RNA Nanotechnology and Nanomedicine (ISRNN) serves to further the development of a wide variety of functional nucleic acids and other related nanotechnology platforms. To aid in the dissemination of the most recent advancements, a biennial discussion focused on biomotors, viral assembly, and RNA nanobiotechnology has been established where international experts in interdisciplinary fields such as structural biology, biophysical chemistry, nanotechnology, cell and cancer biology, and pharmacology share their latest accomplishments and future perspectives. The results summarized here highlight advancements in our understanding of viral biology and the structure-function relation ship of frame-shifting elements in genomic viral RNA, improvements in the predictions of SHAPE analysis of 3D RNA structures, and the understanding of dynamic RNA structures through a variety of experimental and computational means. Additionally, recent advances in the drug delivery, vaccine design, nanopore technologies, biomotor and biomachine development, DNA packaging, RNA nanotechnology, and drug delivery are included in this critical review. We emphasize some of the novel accomplishments, major discussion topics, and present current challenges and perspectives of these emerging fields. © 2022 Published by Elsevier B.V. on behalf of Research Network of Computational and Structural Bio-

technology. This is an open access article under the CC BY-NC-ND license (http://creativecommons.org/ licenses/by-nc-nd/4.0/).

Contents

1. 2.	Introo Resea	Introduction			
	2.1.	2.1 Biomotors and biomachines	6121		
		2.1.1. The push-to-open mechanism and the challenge of tethered mechano-sensitive ion channel NompC	6121		
		2.1.2. The asymmetrical revolving motor mechanism	6123		
	2.2.	Nanopore and nanozyme technologies	6123		
		2.2.1. Protein fingerprinting through nanopores	6123		

E-mail addresses: guo.1091@osu.edu (P. Guo), kafonin@uncc.edu (K.A. Afonin).

¹ Authors contributed equally.

https://doi.org/10.1016/j.csbj.2022.11.007

2001-0370/© 2022 Published by Elsevier B.V. on behalf of Research Network of Computational and Structural Biotechnology. This is an open access article under the CC BY-NC-ND license (http://creativecommons.org/licenses/by-nc-nd/4.0/).

^{*} Corresponding authors.

		2.2.2.	Computational design of nanozymes for biomedical applications	6123	
	2.3.	Riboso	mal frameshifting elements	6123	
		2.3.1.	Programmed ribosomal frameshifting: A potential broad range target for antiviral therapeutics	6123	
		2.3.2.	Unraveling structures and mechanisms of the SARS-CoV-2 RNA frameshifting element by graph theory and mole	ecular	
			modeling	6125	
	2.4.	RNA st	rructure predicton and assessment	6126	
		2.4.1.	End-to-end prediction of RNA base pairing structures through deep transfer learning of evolution and co-evol	lution	
			information	6126	
		2.4.2.	Cryo-EM reveals conformational dynamics in a multifunctional viral RNA	6127	
		2.4.3.	Correlating SHAPE data to RNA 3D structure	6128	
		2.4.4.	Integrating molecular dynamics simulations and SAXS data	6129	
	2.5.	RNA na	anotechnology	6130	
		2.5.1.	The dynamic property of RNA leads the emerging field of RNA nanotechnology	6130	
		2.5.2.	Strand displacement in nucleic acid nanotechnology	6130	
		2.5.3.	Rationally designed nucleic acid nanoparticles (NANPs) with regulated immune recognition	6131	
3.	Sumn	nary of t	the third conference on biomotors, viral assembly and RNA nanotechnology	6132	
	3.1.	Meetin	ng summary and logistics	6132	
	Declaration of Competing Interest				
	Ackn	owledge	ments	6133	
	Refer	ences .		6133	

1. Introduction

Nucleic acid engineering has been gaining considerable momentum for over a decade since the first meeting of the International Society of RNA Nanotechnology and Nanomedicine (ISRNN). This massive research effort is inspired by the immense potential that RNA offers to basic research and in clinical settings. RNA is a natural biopolymer that is highly integrated in a plethora of mechanisms essential for life and thus, understanding RNA's folding, structure, and functions would allow for the rational design of RNA-based therapies and nanodevices suitable for biomedicines [1,2]. As the translational aspects of the field have advanced, there have been new RNA therapies approved for clinical use [3], most notably-two SARS-CoV-2 mRNA vaccines that were rapidly developed and introduced during the COVID-19 pandemic. Despite these successes, the numerous translational challenges of RNA therapeutics [4–8] still preclude their broader biomedical applications. With the increasing number of research teams whose work focuses on overcoming these barriers, the emerging RNA field keeps moving towards curative goals.

In order to advance the applications of RNA in the fields of nanotechnology and nanomedicine, an interdisciplinary effort must be undertaken. To further this goal, the ISRNN has hosted a biennial meeting series, entitled "Biomotors, Viral Assembly, and RNA Nanobiotechnology". At these events, researchers gather from across the globe to share and discuss their findings in each of these areas, with the most recent boasting presentations from over 15 countries by 68 independent researchers. This critical review aims to cover recent research highlights and perspectives in selected topics; namely, we discuss advancements in the fields of biomotors and biomachines, nanopores, nanozymes, viral frameshifting elements, RNA structure prediction and assessment, and RNA nanotechnology.

2. Research highlights

2.1. 2.1 Biomotors and biomachines

2.1.1. The push-to-open mechanism and the challenge of tethered mechano-sensitive ion channel NompC

The 2021 Nobel Prize in Physiology and Medicine was given to Professors David Julis and Aderm Patapoutian for their discoveries of receptors that sense heat and pain. These breakthroughs launched intense research activities that lead to a rapid increase in our understanding of how our nervous system senses changes in temperature and mechanical stimuli. NompC is a TRP (Transient Receptor Potential) channel that is in the same family as the capsaicin receptor TRPV1. NompC is also a special mechanosensitive ion channel responsible for the sensation of touch and balance in Drosophila melanogaster [9]. Based on a cryo-EM structure of NompC [10], the team performed all-atom molecular dynamics simulations and electrophysiological experiments to study the atomistic details of NompC gating. As shown in Fig. 1, work done in the Shu group showed that NompC could be opened by compression of the intracellular ankyrin repeat domain but not by stretching, and that a number of hydrogen bonds along the force conveyance pathway are important for the mechanosensitivity [11]. Under intracellular compression, the bundled ankyrin repeat region acts like a spring with a spring constant of \sim 13 pN/nm and transfers forces at a rate of \sim 1.8 nm/ps. The linker helix region acts as a bridge between the ankyrin repeats and the transient receptor potential (TRP) domain, which passes on the pushing force to the TRP domain to undergo a clockwise rotation, resulting in the opening of the channel. This could be the universal gating mechanism of similar tethered mechanosensitive TRP channels, which enable cells to feel compression and shrinkage.

The Shu group's experimental collaborators, Prof. Zhiqiang Yan's group, found, using the cell-attached patch clamp method that positive pressure acted on the NompC expressed by Drosophila melanogaster S2 neuro cells, which simulated the compression of the gating spring on NompC [11]. From this experiment, electrical signals were detected from the cells, which indicated that the NompC channel was open in response to the compression of gating spring. By using the cell-attached method with negative pressure, there was no obvious current detected. On the other hand, the outside-out patch clamp method with negative pressure which also simulate the compression of gating spring, they can detect obvious current. These experiments validated the Shu group's findings from MD simulations using in vitro methods. These findings were further validated by Prof. Michael Krieg's research group via an in vivo C. elegans behavior experiment [12]. They found that the movement of *C. elegans* was controlled by two ion channels. Straight-forward movement was controlled by the TREK2 channel, a mechanosensitive potassium channel that



Fig. 1. (A) The compression of the ankyrin repeat (AR) region will generate a pushing force and a torque on the linker helix (LH) domain, pointing to the extracellular side. (B) The LH domain further pushes the transient receptor potential (TRP) domain, leading to a tilt (side view), and (C) a clockwise rotation of the TRP domain (looking from the intracellular side). The motion of the TRP domain pulls the S6 helices to slightly tilt and rotate, which dilates the constriction site of the pore.



Fig. 2. Differentiation of revolving mechanism from the rotation mechanism. Rotation is the object turning along its own axis. Revolving is one object moving around a second object. (A) Earth rotates one round every 24 h, analogous to the rotation of the bolt and nut (B). (C) Earth moving around the sun every 365 days per circles. Revolution is analogous to the RPM (revolution per minute) counting of rotors in ultracentrifugation (D). (E) The DNA translocation motor used a revolving mechanism. The revolving is a result of the sequential action of individual subunits trafficking DNA. DNA hugs the channel wall via sequential handoffs via dimerization of individual gp16 subunits (PDB 2KCA) [23]. This sequential dimerization of the gp16 subunits is ATP driven and traffics one strand of the DNA through the connector through touch and go interactions.

can sense membrane stretching and transmit electric signals. The omega turn movement of *C. elegans* was found to be controlled by the NompC channel, which is stimulated by cellular compression [11]. NompC-knock out *C. elegans* can only go straight while the TREK2-knocked out C elegans can only perform the omega turn movement. Therefore, they summarize an interesting physical model of *C. elegans*. When the *C. elegans* moves straight, the TREK2 channel opens due to the stretch of nerve cells while NompC remain closed. On the contrary, when s *C. elegans* performs an omega turn, the sensory cells are compressed, opening the NompC channel while TREK2 is closed. These findings showed that NompC

plays key roles in sensing touch and proprioception in *C. elegans*, which will provide promising logic element for designing smart *C. elegans*.

The push-to-open gating mechanism of NompC represents a special mechanism for sensing the compression of sensory cells, which is different from other traditional mechano-sensitive ion channels that mainly rely on membrane surface extension and respond to cell expansion. This model provides a promising area for designing smart biosensors in response to mechanical stimuli. Although the sequence and structure of other TRP ion channel family members, such as TRPV1 and TRPV4, is similar to NompC,

whether the gating mechanism of these TRP channels obeys the push to open model remains an open challenge for structural biology. In the near future, the humans will begin to expand their explorations of space. The low gravity conditions in space pose a large challenge to the health of astronauts. Astronauts will face quite different health challenges from those living on earth. The relative studies on the gating of TRP channels under extreme conditions such as low gravity will give new insight to solve these problems.

2.1.2. The asymmetrical revolving motor mechanism

A key characteristic of "living beings" is movement. These motion activities are usually performed by ATPase motors [13,14]. One of the most important motor functions is dsDNA translocation, which occurs during DNA replication, cellular mitosis, plasmid conjugation, DNA repair, and dsDNA viral genome packaging. The motor of these essential living processes shares plenty of similarities, such as the structure and mechanism. A rotatory mechanism has become a common belief due to the helical structure of the substrate DNA; however, the rotation mechanism is questioned based on several experimental data [15,16]. To solve this problem, a revolving mechanism is proposed [17]. Rotation involves the turning of an object around its own axis like Earth moving around its axis every 24 h, while revolving is the circular motion of an object around a secondary object, similar to Earth orbiting the sun every 365 days. Studies of the structure of biological motors in different species have suggested a similar revolving mechanism that can transport the long dsDNA genome. This mechanism is established in the dsDNA packaging motor of the bacterial virus phi29, which uses six ATPases to work in sequential action (Fig. 2) [18,19]. Several other biomotors have been reported to function in the revolving mechanism as well, such as the packaging motor of herpesviruses [20], the cell division motor of Escherichia coli FtsK [21], and plasmid conjugation motor TraB in streptomyces [22]. The studies of these motors suggest an asymmetric hexameric structure for transporting dsDNA in the sequential mechanism of action that is the motor contains four monomer subunits and one dimeric subunit arranged in an asymmetrical structure. The finding may help understand why huge genomes, including chromosomes, translocate in complex systems without coiling and tangling, which will decrease the speed of dsDNA translocation and consume more energy.

2.2. Nanopore and nanozyme technologies

2.2.1. Protein fingerprinting through nanopores

Nanopore technology has demonstrated its ability to detect fine molecular details, allowing the study of subtle changes in protein or RNA conformation [24,25], characterization of short polypeptide chains with single amino acid resolution, detect and identify specific amino acids [26,27] and detect subtle chemical modifications [28,29] or post-translational modifications [30,31] all which led to the hope of directly sequencing whole proteins. In addition, the biological nanopore can be reengineered to be inserted in lipid bilayer system or commercially available platform [32,33].

While recent efforts to sequence proteins at the single-molecule level using nanopores have shown promise [28,34,35] reading the protein sequence remains a challenge. Considering the complexity of identifying proteins by reading their sequence, a new approach to identify proteins without reading their sequence has recently been demonstrated [36,37]. This approach consists on identifying proteins by monitoring fragments resulting from the reaction products of a protease through biological nanopores and using protein databases to determine to which protein those fragments correspond, in a manner roughly similar to mass spectrometry (Fig. 3). Specifically, it has been demonstrated that the AeL nanopore

enables discrimination between three different proteins with approximately the same molecular mass, opening up the possibility of extending this approach to the identification of proteins irrespective of their size, charge, and structure/conformation [36]. This new approach, which can easily be miniaturized, could replace mass spectrometry as a part of the protein identification workflow. If implemented by a commercial entity, the technology could be made practical and low cost enough for use at point-of-care facilities, as the identification of proteins for health-care applications does not require full sequencing.

2.2.2. Computational design of nanozymes for biomedical applications

Many inorganic nanomaterials have intrinsic catalytic activities in living cells mimicking those of oxidoreductases, which endow the nanomaterials with intriguing potentials in biomedical applications [38]. These nanomaterials are collectively called nanozymes. For example, the peroxidase-activity of nanomaterials activates H_2O_2 , which is abundant in tumor cells, to abstract electrons from the surroundings and thus induces apoptosis or necrosis of tumor cells. The catalase-like activity converts H_2O_2 into O_2 , which is useful to attenuate tumor hypoxia. The superoxide dismutase-like activity is useful for scavenging $O_2^{\bullet-}$, providing the nanomaterials with anti-oxidant activity. Owing to their enzymelike activities, the nanomaterials have potentials in tumor chemodynamic, anti-hypoxia, and antioxidant protection therapies (Fig. 4).

Because specific biomedical applications require that the nanomaterials have high catalytic activities, it is desirable to understand the atomistic-level mechanisms for the catalysis and develop theoretical methods to evaluate the activities prior to experimental applications. Density functional theory calculations have played an indispensable role in studying atomistic mechanisms and structure–activity relationships for catalysts. Using these calculations, the Gao group has studied the mechanisms for the above oxidoreductase-like activities and further developed theoretical methods to predict the peroxidase-, catalase-, and superoxide dismutase-like activities of nanomaterials, paving a road for the application-targeted design of nanozymes [39–41].

However, challenges still remain. Among them, a big challenge is to improve the substrate selectivity for the nanomaterial catalysis by *de novo* design, and another question is to improve the accuracy of experimental fabrication and characterization of nanomaterials to comply with the design. Other questions like the long-term toxicity of nanomaterials merit further investigation.

2.3. Ribosomal frameshifting elements

2.3.1. Programmed ribosomal frameshifting: A potential broad range target for antiviral therapeutics

Human population growth, climate change, and globalization are accelerating the emergence of novel pathogenic viruses. Many viruses use a programmed -1 ribosomal frameshift (-1 PRF) mechanism to direct synthesis of their replicase proteins, a critical switch in their replication program that can be therapeutically targeted [42]. Nearly half a century of research into -1 PRF have provided insight into its biological importance, the molecular mechanisms that drive it, and approaches that can be used to manipulate it towards therapeutic outcomes, with particular emphasis on SARS-CoV-2.

The -1 PRF is a kinetically driven process. Elongating ribosomes are forced to pause over heptameric "slippery sequences" by metastable frameshift stimulating elements (FSEs) on mRNAs, typically pseudoknots [43]. Emerging evidence suggests that the frequency of -1 PRF events is dictated by the extent of structural heterogeneity, or Shannon Entropy, of these FSEs [44]. The idea is that the



Fig. 3. Following protease digestion, peptide fragments of various lengths and sequence can be distinguished as they travel through a nanopore as a function of the normalized current across the membrane, resulting in a unique fingerprint for each protein.



Fig. 4. (A) The enzyme-like activities of nanomaterials and (B) potential biomedical applications.

greater the number of structures that a sequence can sample, the greater the chance that one will be sampled that favors ribosome slippage. The ribosome is also an active player in the frameshift process. The dynamic conformational changes that it undergoes as it transits through the elongation cycle, along with the hydrolysis of GTP by the elongation factors provides the energetic inputs required to overcome the otherwise energetically unfavorable slippage events [43]. While -1 PRF is ultimately a stochastic process, each individual -1 PRF signal is evolutionarily fine-tuned to shift ribosomes at a specific frequency.

First demonstrated using the yeast "Killer" virus system [45], the idea that altering –1 PRF rates negatively impacts viral replication has been broadly demonstrated in retroviruses, coronaviruses, flaviviruses, alphaviruses, and others [42]. Decreases in –1 PRF can result in large, *e. g.*, 3–4 orders of magnitude, decreases in viral copy numbers [46–48]. The triple-stem loop FSEs of coronaviruses present particularly promising therapeutic targets, as they harbor ring and hole structures conveniently sized to accommodate drug-sized small molecules [49–51]. Recently, high throughput screens have identified FDA approved drugs that alter SARS-CoV-

2-1 PRF efficiency, as well as -1 PRF promoted by other coronaviruses that may potentially emerge into the human population [52-54]. However, these small molecules were originally optimized to interact with proteins; efforts should be devoted toward developing RNA-specific interactors.

Although numerous academic and private entities are currently targeting the -1 PRF signal of SARS-CoV-2, the challenge of drugging a highly dynamic RNA structural element situates these efforts at the cutting edge of technology. Further, while -1 PRF is an essential regulatory element for many viruses, each viral -1 PRF signal is unique, likely necessitating developing -1 PRF signal-specific drugs for every virus. Additionally, as it is becoming clear that -1 PRF is used to regulate human gene expression [55,56], the activities of such antiviral agents on -1 PRF in cellular genes will have to be investigated, although, as noted above, the unique nature of each -1 PRF signal may allay this concern. On a positive note, since the -1 PRF signals of each virus are highly conserved, this mitigates worries about drug-resistant bypass mutations. As we try to peer over the horizon to prevent the next pandemic(s), -1 PRF represents an important target to add to the arsenal of antiviral therapeutic strategies.

2.3.2. Unraveling structures and mechanisms of the SARS-CoV-2 RNA frameshifting element by graph theory and molecular modeling

Despite the ongoing vaccination campaigns across the world, we are entering the third year of the COVID-19 pandemic with new waves of infection by SARS-CoV-2 and witnessing mutations that continue to evade our immune system while producing alarming symptoms in increasing cohorts and parts of the world. It has become clear that simple solutions are difficult and that more fundamental scientific knowledge, as well as clinical evidence, is required to address current and future viral infections that inevitably will arise.

Fortunately, the level of scientific cooperation and advances we have witnessed since early 2020 offers hope. Besides successful vaccine development efforts, progress on unraveling the complex and multifarious biophysical aspects of the virus life cycle and infection trajectory has helped us describe how the virus hijacks our own protein-synthesis machinery into making viral proteins efficiently and propose new lines of defense against the deadly disease it carries. These insights into the life cycle of the virus and mode of action are invaluable for further development of drugs and other strategies to combat current and future viral epidemics.

Investigations of the RNA viral agent itself are crucial for understanding how the RNA invader replicates itself, is translated by the human ribosomal machinery, assembles, and synthesizes a suite of viral proteins that enable the continuation of its invasive trajectory. Importantly, RNA-targeting therapeutics and vaccines can disarm the origin of the infection rather than its products and potentially be more effective in the long term. However, the complexity of the RNA molecule and the lagging science about its modeling, imaging, and drug screening, as compared to proteins, poses several challenges. With technological improvements in RNA delivery systems, the rise of CRISPR-based gene editing systems [57,58], and improved RNA modeling techniques [59,60], this RNA focus is not only warranted but clearly successful, as evidenced by recent mRNA-based vaccines.

Of particular interest by many groups is the RNA frameshifting element (FSE), a small region in the open reading frame ORF1a,b region (Fig. 5A) of the viral genome that codes for the polyproteins that initiate the cascade of viral protein synthesis. The FSE is responsible for the crucial -1 PRF mechanism utilized by many viruses, including HIV-1, to handle protein synthesis from overlapping reading frames [61–63]. A pseudoknot (intertwined hydrogen-bonding), or a stem-loop motif, is believed to be crucial for the requisite pausing associated with frameshifting [63–65].

When encountering ORF1b, out of register with respect to ORF1a, the ribosome backs up one nucleotide in the 5' direction to define a different sequence of codons (Fig. 5). Because studies indicate correlations between the FSE conformational plasticity and frameshifting efficiency, it is likely that more complex conformational mechanisms are involved rather than a simple "barrier" [42,66–68]. Indeed, the discovery of many alternative conformations of the SARS-CoV-2 FSE [50,69–78] suggest a complex conformational and thermodynamic landscape.

The FSE's crucial role in viral protein synthesis makes it an excellent target for therapeutic intervention [42,79,80]. Already, small-molecule agents such as 1,4-diazepane derivative 10 (MTDB) (originally designed for SARS-CoV [68,81,82]), fluoroquinolone antibacterial merafloxacin [74], and a phenyl thiourea C5[83] were found to hamper SARS-CoV-2 frameshifting. However, a mechanistic understanding of the process and the drug effect is unknown. Complexity is inherent in the makeup and variability of the FSE region. The 84-residue SARS-CoV-2 FSE (13462–13545 of the 29,891 nt RNA genome) contains a 7-residue slippery site (UUUAAAC) and a 77-residue conformationally flexible region (Fig. 5). Besides the folds and mechanisms of the RNA FSE itself, important interactions are involved between the FSE and the ribosome during viral protein synthesis.

The Schlick group focuses on better understanding the conformational landscape of the FSE using a combination of complementary graph-based modeling and chemical reactivity and other experiments. Already, several groups have explored FSE structure by modeling [49,69,77,78,84], in vivo Selective 2'-Hydroxyl Acylation by Primer Extension (SHAPE) [85,86] and DMS structure probing experiments [50,70–76], NMR [87], Cryo-EM [50,51], and other biophysical mutational profiling and scanning approaches [82,88,89].

Many have characterized the FSE of SARS-CoV-2 as a 3-stem hairpin (H-type) pseudoknot with colinear Stems 1 and 2 intertwined via a pseudoknot and perpendicular Stem 3. This association has persisted from the SARS-CoV FSE characterization [82], which differs in only one base from the SARS-CoV-2 FSE (residue A13533 in Covid-19 is C in SARS, Fig. 5). However, depending on the modeling software and experimental technique, alternative secondary structures have been reported for SARS-CoV-2, both pseudoknotted and unknotted [50,69–78].

Developing further and applying the RNA-As-Graphs (RAG) graph-theory tools for handling pseudoknots [90-94] to the SARS-CoV-2 FSE, the Schlick group has designed double mutants, shown in Fig. 5B, that dramatically alter the FSE conformation (see [84] and accompanying New & Notable commentary [95]). These mutations define target residues for drug binding and gene editing. By further probing the FSE structure as a function of length and performing chemical reactivity experiments with SHAPE, we have described alternative forms of the FSE [96]. Notably, the combined complex conformational landscape has three viable structures of the FSE: two 3-stem pseudoknotted RNAs (3_6 and 3_3 in the dual graph notation), and one unknotted, 3-way junction RNA (3_5) (Fig. 5B). The flexible Stem 2 may be involved in a switch between these conformations and associations with the ribosome during protein translation, as well as define a co-transcriptional kinetic folding trap. For whole genome constructs, a stem-loop motif (2_2 graph) may also compete with these forms. In addition, we confirmed experimentally that other designed FSE mutants stabilize one conformation over all others [97], lending confidence in these mutational transformations. These conformation-specific mutations may be particularly effective when used in combination with anti-viral compounds that target a specific FSE form. The Schlick group's recent molecular dynamics studies of these alternative conformations at various lengths suggest key transition states that are shared by all three FSE conformations and, importantly, pathways for inter-conversion among them [97]. These studies also point to several therapeutic avenues, including interference with FSE transformations, FSE/ribosome interactions, and FSE folding. Ongoing research is addressing these possible therapeutic avenues as well as the dynamic mechanisms associated with frameshifting.

2.4. RNA structure predicton and assessment

2.4.1. End-to-end prediction of RNA base pairing structures through deep transfer learning of evolution and co-evolution information

Predicting RNA secondary structure has long been dominated by folding-based algorithms, which require a scoring function coupled with a minimum-searching algorithm. These predictions, however, are often limited to nested and stacked canonical base pairs (i.e., AU and GC Watson-Crick and GU wobble base pairs), while ignoring other hydrogen-bonded bases stabilized by tertiary interactions. The ignorance reflects the difficulty to predict "tertiary" base pairs without knowing three-dimensional structures. Structure-stabilized base pairs include un-nested (pseudoknot), noncanonical and isolated lone base pairs as well as base triplets. Thus, a gold-standard dataset for these "tertiary" base pairs requires experimentally determined three-dimensional structures. However, there are only a few thousand RNA struc-



A Three Conformations of the SARS-CoV-2 Frameshifting Element

Fig. 5. FSE sequence, three relevant 2D structures for the SARS-CoV-2 84 nt FSE (residues 13462–13545) emerging from the Schlick group's work [84,96] and mutants that transform the 3_6 motif and stabilize all conformers, using graph based models, 2D structure prediction, SHAPE structural probing, thermodynamic ensemble modeling, and molecular dynamics simulations [97]. (A) The -1 frameshifting moves the transcript UUU-UU*A(Leu)-AAC(Asn)-GGG at the second codon (asterisk) to start as AAA-CGG(Arg), so that translation resumes at CGG. Top: FSE sequence, with the attenuator hairpin region, the 7 nt slippery site, and A13533 labeled (C in SARS). The ORF1a end and ORF1b start codons for the overlapping regions are marked. For each 2D structure, 3_6 pseudoknot, 3_3 pseudoknot, and three-way junction 3_5 (unknotted RNA), we show corresponding dual graphs, 2D structures, and arc plots, with color-coded stems and loops. (B), Left: Mutants that stabilize each conformer; (B), Right: Double mutants that transfirm the 3_6 form into other RNAs. B, Middle: Straight to L-shape transition captured in the simulation for wild type 3_6 system, which is suppressed in the 3_6 system.

tures that have been solved so far. Such a small number of RNA structures makes it challenging to apply deep learning to RNA structure prediction.

Recently, Singh et al. showed that the above problem can be addressed by using a highly accurate but approximate database of RNA secondary structures for initial training [98]. The initial training is followed by transfer learning with a small dataset of full base-pairing structures derived from RNA structures. The resulting method called SPOT-RNA showed that a single sequence (i.e., without information of homologous sequences) can provide a significant improvement over the stagnant accuracy of secondary structure prediction by folding-based algorithms in recent years. The most significant improvement is in "tertiary" base pairs such as pseudoknots, noncanonical and lone base pairs.

To further improve the above prediction, it is necessary to incorporate sequence conservation and co-variation information as in proteins. However, unlike proteins, 4-letter coded RNA can easily lose their sequence identity in evolution. Thus, it is necessary to incorporate structural information in homology search as has been done in INFERNAL [99], which searches homology sequences using a secondary-structure-based covariance model. RNAcmap is the first fully automatic pipeline that performs homology search, multiple sequence alignment, and direct coupling/comutational analysis in a single run [100]. Incorporating sequence profiles and mutational coupling generated by RNAcmap yields another significant improvement in RNA secondary structure prediction (SPOT-RNA2 [101]) and distance-based contact prediction (SPOT-RNA-2D [102]) for those RNAs with a significant number of homologous sequences, in particular. One example was shown in Fig. 6, where SPOT-RNA2 provided accurate prediction of tertiary base pairs. The result highlights the usefulness of deep learning and multiple sequence alignment for the problems related to RNA structure prediction. RNAcmap, SPOT-RNA, SPOT-RNA2 and other RNA/protein-related tools (SPOT-RNA-1D for backbone structure [103] and RNAsnap2 for solvent accessibility [104]) are available for download or as online servers at https://sparks-lab. org.

Despite the above progress, many challenges remain. For example, RNA homologies remain difficult to find, for long RNA sequences (>1000 nucleotides) in particular [100]. Moreover, even with perfect contact maps as restraints, many RNA structures remain elusive [103] because RNA backbone structures have a much higher degree of freedom (6 torsion angles) than protein backbone structures (2 torsion angles). Better energy functions are certainly needed [105]. More importantly, the number of 3D structures in protein databank is insufficient for typical deep learning techniques. Thus, it is likely that a combination of deep learning with RNA-specific scoring/energy function is required to make significant progress in the foreseeable future [106].

2.4.2. Cryo-EM reveals conformational dynamics in a multifunctional viral RNA

Development of new nanotechnologies based on engineered RNA structures depends on knowledge of the fundamental properties of RNA folding and its conformational dynamics [107]. The modular architecture of RNA can be exploited to rationally build RNA structures [108,109], but we need to solve the structures of more, and more dynamic, RNA structures to understand underlying principles and discover conformationally dynamic 'building blocks' for use in RNA nanotechnology.

Viruses ubiquitously use structured RNA elements as part of their overall infection strategy, and for regulating the formation of the capsid [110–112]. Many structured viral RNA elements are multifunctional, a feature that may depend on conformational changes programmed into the RNA structure. Thus, explorations of these RNA elements can yield new tools for RNA nanotechnology while revealing fundamental features of RNA folding and dynamics. Although traditional structural methods are ill-suited for large, structurally dynamic RNAs, advances in cryo-electron microscopy (cryo-EM) may provide a new way to explore these RNAs.

Examples of structured, multifunctional, and perhaps conformationally dynamic RNA elements are the tyrosine-accepting tRNA-like structures (TLS^{Tyr}). TLS^{Tyr} are found at the 3' end of specific single-stranded positive-sense RNA viral genomes [114,115]. They are aminoacylated by the host cell's tyrosine aminoacyl tRNA synthetase (Tyr-AARS) and regulate several viral processes. These characteristics suggest TLS^{Tyr} are tRNA mimics that undergo programmed conformational changes, but their structure had remained elusive for decades.

The Kieft group has used single-particle cryo-EM to solve the structure of a representative TLS^{Tyr} RNA (~55 kDa) in both its unbound form and bound to Tyr-AARS (Fig. 7) [116]. The unbound RNA comprises a complex structure of multiple helical elements emanating from a central junction. Surprisingly, the structure does not directly mimic tRNA, suggesting it must change conformation to productively bind the Tyr-AARS. Further analyses revealed that the part of the RNA that acts as the anticodon loop mimic is within a conformationally mobile domain. The structure of the TLS^{Tyr} RNA in the Tyr-AARS-bound state subsequently showed that this mobile domain adopts a position at a roughly right angle to its position in the unbound state. This mode of binding differs dramatically and unexpectedly from that of an authentic tRNA.

These findings show that programmed conformational dynamics are an inherent and necessary component of TLS^{Tyr} RNA's ability to hijack the host cell synthetase. Furthermore, there exist two distinct bound states, one in which the TLS^{Tyr} RNA is making limited contact with the enzyme and one in which the 3' end of the RNA is 'pulled into' the enzyme's active site. Although we cannot ascribe an order of events to these states, they suggest a multistep mechanism of binding that may be more generally applicable. Overall,



Fig. 6. Base pair prediction for 70S ribosome (PDB 6CAE, chain 1Y) by (A) CentroidAlifold [PR = 95, SN = 67], (B) SPOT-RNA [PR = 93, SN = 83], and (C) SPOT-RNA2 [PR = 94, SN = 97], compared to (D) the native as labelled. All false positives are shown in red. Tertiary base pairs (noncanonical base pairs in orange and pseudoknots in green) are the most visible improvement from the traditional folding algorithm (CentroidAlifold, limited to canonical base pairs in blue) to SPOT-RNA without evolution information and SPOT-RNA2 with evolution information. Copyright (2021) Oxford University Press.



Fig. 7. Structure of a TLS^{Tyr} RNA (grey and purple) in the unbound form (left) and bound to a Tyr-AARS, which is colored orange (center and right). Solvent-accessible surfaces are shown. The purple TLS^{Tyr} RNA domain is dynamic relative to the rest of the molecule (grey), adopting different positions in the unbound versus bound states.

these studies show the power of cryo-EM to detect and characterize conformational changes in RNAs that have been largely intractable by other methods.

2.4.3. Correlating SHAPE data to RNA 3D structure

The talk from Shi-Jie Chen's research group from the University of Missouri, Columbia, focused on a novel method for data-assisted RNA structure prediction. As a readily available alternative to X-ray footprinting of RNA for assessing secondary and tertiary structures which does not require the use of a synchrotron, selective 2'hydroxyl acylation analyzed by primer extension (SHAPE) provides insights into the flexibility of nucleotides [117,118]. A SHAPE ligand such as 1-methyl-7-nitroisatoic anhydride (1 M7) reacts with nucleotides in the flexible regions of RNA (flexible loops) and does not react with nucleotides in rigid regions (helices, rigid loops). SHAPE is known to supply effective constraints for the prediction of a 2D structure (base pairs) [85]. However, nucleotide flexibility is determined by atomic interactions, which is 3D. Thus, SHAPE reactivity is intrinsically tied to the 3D structure of RNA. The Chen lab has developed, SHAPER [119-120], a web server (URL: https://rna.physics.missouri.edu/shaper/) that can compute the SHAPE profile from a 3D RNA structure. Combined with computer simulations that can generate a pool of candidate 3D structures, SHAPER would provide a novel, SHAPE data-driven, method to efficiently identify the native structure or near-native structures by removing SHAPE-incompatible structures from the pool of candidate structures.

The key product of the model is a new estimator of SHAPE reactivity for each nucleotide in a given 3D structure [85,119]. The main driver of the prediction is the energy-like score that connects the SHAPE reactivity profile to the energetics of the nucleotide. This SHAPE energy score is related the 3D interaction energy that combines the effects of base pairing and stacking to estimate the interaction strength for a nucleotide. This score also accounts for several key factors including ligand accessibility, sugar conformation, and the effect of terminal residues due to alterations of the terminal regions of the RNA during the experiment. Because a SHAPE reaction occurs at the 2'-OH, the SHAPE ligand has to access the space between the nucleotide being scored and the nucleotide directly downstream, so the interaction strength of these two nucleotides with other members of the RNA and the 5' to 3' polarity of the nucleotide interactions are very important to the ability of the SHAPE ligand to react. Furthermore, Chen lab found that including the non-nearest-neighbor interactions of these nucleotides is also important in estimating the SHAPE reactivity.

Overall, this new model displays substantial promise in the assessment tested. For a structure, the Pearson correlation is calcu-

lated between the predicted SHAPE profile and the experimental profile. The result (Fig. 8) of the Spearman rank correlation between the Pearson correlation and the interaction network fidelity (INF) show that the model is able to discern between nearnative and non-native structures with a high degree of accuracy. Taken together, these results suggest that the model is both sensitive and accurate in identifying the native or near-native 3D folds of an RNA. Combined with SHAPE data, the model would provide a powerful tool for RNA nanoparticle design based on the desired RNA native structures [122–127], RNA conformational changes [129–131], and RNA-ligand interactions [133–134].



Fig. 8. The figure shows the trends between the Pearson correlation. INF and RMSD for Lysine riboswitch (PDBID: 3DIG). The INF is a measure that captures native interactions, so the reference native structure has an INF of 1. The RMSD is the root mean squared deviation of the structure, so the reference native structure has an RMSD of 0. Structures in the green region are the decoys generated from a simulation of the native RNA with the backbone and base pairs restrained. The blue region represents a similar ensemble of structures, except that the base pairs are no longer restrained while the backbone atoms are restrained to maintain the global folding. Structures in the purple region are the decoys generated from coarsegrained simulations with the base pairs enforced, but no backbone restraints. The black region shows an ensemble of alternative (nonnative) low-energy 2D structure decoys generated from coarse-grained simulations. The projections of the decoy structures are shown as shadows in each 2D plane. We see that as the INF increases and RMSD decreases, i.e., as the structure approaches the native state, the Pearson correlation between the SHAPER prediction of the SHAPE reactivity and the experimental SHAPE reactivity of the structures increases, indicating that the model is successful in estimating the SHAPE reactivity for decoy structures. This may be used for predictive purposes. By sieving low-energy decoys, the model can improve predictions RNA structure prediction by removing structures that are incompatible with SHAPE data.

L. Rolband, D. Beasock, Y. Wang et al.

There are two major challenges to the SHAPER model. First, the SHAPE data used to train the model are from various systems and may rely on different data processing of the raw data. Therefore, the model may suffer from the quality of the training data set. This has been shown by a previous attempt of using machine learning to predict the SHAPE profile from a 3D RNA structure [136]. Second, the correlation between intra-molecular interactions and SHAPE reactivity is not fully clear, which would directly impact the reliability of the model. In future developments, more highquality SHAPE data needs to be collected for different RNA structures, in particular, for RNA nanoparticle structures. With such data, the SHAPR model will be refined to more effectively and accurately sieve incorrect 3D folds and identify the correct native structures for RNA nanoparticles. Furthermore, future development of the SHAPER model should rely on a rigorous model for intramolecular interactions, in particular, for the non-canonical base-pairing interactions in different tertiary structural motifs. Better models of the interactions demand more biophysical data on RNA structure and stability.

2.4.4. Integrating molecular dynamics simulations and SAXS data

Small angle X-ray scattering (SAXS) experiments are valuable in providing information about size and shape of RNA molecules and thus optimally complement other biophysical techniques [137,138]. Given their low resolution, SAXS data must be inte-

grated with accurate modeling tools so as to provide detailed structural information. For a single molecule in vacuum, frozen in a single conformation, scattering intensities are straightforwardly related to the radial Fourier transform of the atomic coordinates. However, for biomolecules in solution, two additional factors might make the interpretation more difficult, namely (a) the contribution of the solvent and (b) the presence of multiple alternative conformations in the same buffer (RNA dynamics).

Molecular dynamics simulations allow for RNA dynamics to be investigated at atomistic resolution and are currently a standard tool for structural biology studies [139]. Notably, they can be combined with SAXS data so as to provide an interpretation of the experiment at atomic resolution [140]. In theory, they allow both factors mentioned above to be considered. Solvent effects can indeed be included by explicitly subtracting a separate buffer simulation, similarly to what is done in experiments [141,142]. At the same time, the presence of multiple conformations naturally arises from the spontaneous structural fluctuations, which can be directly averaged. Given the typical timescales required for RNA conformation changes, this can only be obtained by using suitably designed enhanced sampling methods [143]. These two ideas have been however rarely combined.

In a recent work [144] (see also Fig. 9), the Bussi group has shown how solvent effects and RNA dynamics can be brought together to characterize the ion-dependent population of compact



Fig. 9. Integrating enhanced sampling simulations and SAXS data. (A) Molecular dynamics simulations with enhanced sampling techniques allow the extraction of a free energy surface (FES) as a function of one or more collective variables (CV1 and CV2). (B) The generated ensemble contains both compact and extended structures, and associates them with a population. (C) SAXS experiments at different ion concentrations provide a spectrum that is affected by solvent effects and ensemble averages. (D) The combination of molecular dynamics and experiments allow RNA dynamics to be reconstructed at atomistic resolution. Copyright (2021) Oxford University Press.

and extended states of the GTPase-associated center, an RNA molecule involved in protein translation for which SAXS data were previously reported [145]. Specifically, an enhanced sampling method [146] was used that encourages the exploration of structures with heterogeneous SAXS spectra, by quickly estimating spectra on-thefly without including solvent effects [147]. This allowed to generate an ensemble consisting of a mixture of compact and extended structures. The SAXS spectra for the generated ensembles were then reconstructed by explicitly including water contributions and modeling the experimental buffer subtraction [141], and use the maximum entropy principle to reweight the results so as to match experiments [148]. The results show that different populations of compact and extended states are required based on the type and concentration of ions present in the buffer.

Overall, these results show that both conformational dynamics and solvent effects play an important role in SAXS spectra of RNA, and indeed, neither of the two effects can separately account for the experimental results. The importance of the solvent might be ascribed to the highly charged nature of RNA. At the same time, the observation that rich and heterogeneous conformational ensembles are required to match experiments underlines the importance of RNA dynamics in analyzing data obtained in solution.

Given the relative simplicity of small (and wide) angle X-ray scattering experiments (SAXS and WAXS) when compared to other biophysical techniques, as well as their capability to capture dynamical effects, the application of these techniques to RNA systems is gaining momentum. At the same time, several methods are emerging to combine them with molecular modeling techniques so as to extract the maximum amount of information. We believe that this field will see other methodological developments in the next few years. In addition to methods based on maximizing entropy, such as the one discussed above, other techniques based on the maximum parsimony principle, such as sample-and-select, have been recently applied to RNA [149]. These techniques have the advantage of reporting a limited number of structural models, and thus provide more interpretable results, at the price of ignoring a possibly relevant fraction of conformation dynamics. A future challenge in the field is certainly the synergistic integration of these ideas so as to combine their benefits. Finally, it is important to recognize that the applicability of atomistic molecular dynamics simulations to medium-sized (50-100 nucleotides) RNAs is extremely expensive, especially in the most interesting cases where conformational dynamics is important. The field will thus certainly benefit from the development and availability of novel enhanced sampling methods based on the application of machine learning techniques [150]. An alternative approach is that of using coarsegrained models that have an inherent advantage when compared to MD in their capability to quickly generate large sets of heterogeneous structures [151]. Hence, we believe that future research should be aimed at developing methods to increase the accuracy in the back-calculation of SAXS and WAXS spectra when using coarse-grained representations of RNAs.

2.5. RNA nanotechnology

2.5.1. The dynamic property of RNA leads the emerging field of RNA nanotechnology

RNA folds into thermostable structures and nanocomplexes with defined stoichiometry, size, and shape from one or multiple RNA oligo strands [152–161]. RNA ensemble structures hold a higher level of apparent entropy (S), or structural disorder than DNA, despite RNA possessing more a compact helical region [107,152,161]. Helical regions of RNA are highly structured and inflexible, but other elements, such as loops and bulges, are capable of dynamic motions capable of interacting with small mole-

cules and receptors via induced fit models [153]. The high level of entropy and the ability for dynamic motions allow for RNA to have the property of movement, motion, and deform shapes much like an amoeba. This amoeba-like property has often been encompassed in a worm/snake-like chain structural model and possesses unique biodistribution properties [163,164].

Methods for examining the motion and movement of RNA utilize nuclear magnetic resonance (NMR) [154–158], X-ray crystallography [165,166], single-molecule imaging microscopy [167–168], and cryogenic electron microscopy (cryo-EM) [169,170].

RNA moves to change conformations in the presence of a ligand during the binding of proteins, or when undergoing cotranscriptional dynamic folding and restructuring, demonstrating movement during enzymatic behaviors in accordance with the induced fit model of substrate ligand interactions [153,159-161.166]. Besides mRNA. rRNA. and tRNA. cells contain many other noncoding RNA for critical functions in the regulation of basic cellular functions [173-174]. The dynamic nature of RNA results in its motile and deformative behavior which is interacting with a large variety of cellular functions aside from post-transcriptional and translational functions. This deformative property is highlighted in Fig. 10. Conformational transitions change base-pairing, breathing within complemented strands [176], and pseudoknot formation at a 2D level [177], as well as the induced-fit [178] and conformation capture at the 3D level [179] which are important for biological functions including regulation, translation, and catalysis. The dynamic conformational transition follows the nearest neighbour principle to determine an ensemble of transient states with respective Gibbs free energies sitting around the "lowest" Gibbs free energy state which are adopted at any moment [180]. The dynamic, motile, and catalytic activity has led to a belief that RNA is the origin of life in the RNA world hypothesis, underscoring the interest in understanding RNA structural dynamics [181]. This deformative property of RNA nanoparticles enhances their trans vascular permeability past the leaky blood vessels associated with angiogenesis while also rapidly passing the glomerular membrane for rapid body clearance. The biodistribution of RNA nanoparticles can be further improved by the incorporation of ligands for entry into solid tumours with extensive vascular networks [164]. The negative charge of RNA decreases the toxicity of drugs carried by this platform by preventing nonspecific binding to the negative charge cell membrane while enhancing the solubility of hydrophobic drugs for favourable hemodynamics [182]. These unique properties of RNA nanoparticles and the mechanism of RNA dynamic, motile and deformative properties were presented at the meeting to welcome RNA therapeutics as the third milestone in pharmaceutical drug development.

2.5.2. Strand displacement in nucleic acid nanotechnology

Strand displacement is a reaction between DNA or RNA strands that is essential to dynamic nucleic acid nanotechnology, and has been used in nucleic acid circuits designed for molecular computing, as well as in synthetic biology and molecular sensing [183]. Furthermore, there is increasingly more evidence that strand displacement is also involved in numerous naturally occurring processes, such as during RNA cotranscriptional folding or during RNA invasion into double-stranded DNA in the CRISPR-Cas9 complex [184].

The Sulc group has studied toehold mediated strand displacement reaction (TMSD) [185–186]. It consists of an invader strand that binds to a complementary strand (substrate) that has been previously bound to another complementary strand (incumbent) (Fig. 11). The substrate strand has a single-stranded overhang (toehold) to which the invader bounds prior to removing the incumbent.

Computational and Structural Biotechnology Journal 20 (2022) 6120-6137



Fig. 10. RNA nanoparticles stretched via dual trap optical tweezer by Guo and colleagues. (A) Dual trap optical tweezers with tethered RNA construct between two dsDNA handles via affinity linkers. (B) Control force–extension curve for stretching (red) and relaxing (black) of RNA nanoparticle as a square. Inset: Point at which the nanoparticle undergoes conformational change in response to force. [171] (C) RNA nanostructures constructed through using the dynamic property of pRNA 3WJ its natural angles of 97, 138, and 125 respectively, tunable past its these natural angles to 60°, 90°, and 108° respectively. [172] (A-B) Reprinted (adapted) with permission from Ghimire et al 2019. Copyright 2019 American Chemical Society. (C) Copyright 2014 Oxford University Press.



Fig. 11. A schematic representation of the toehold-mediated strand displacement reaction that was previously simulated with a coarse-grained RNA model. (A) Invader starts to bind to toehold. (B) Invader strand fully bound to the toehold. (C) Invader starts to replace base pairs between the incumbent and the substrate. (D) Invader fully replaces all bonds between the incumbent and the substrate.

While the kinetics and thermodynamics of the TMSD reaction between DNA strands has been studied in detail for DNA nanotechnology via computational and experimental studies, there has not been a systematic study of such systems experimentally carried out when RNA strands are involved. Experiments have also not been carried out for hybrid reactions, where either RNA invades a DNA duplex, thus creating RNA-DNA hybrid, or when DNA strands invades an RNA duplex. The Sulc group has performed an experimental study where they varied the length of the toehold for RNA TMSD, as well as introduced mismatches between the invader and the substrate. Through this work, it was found that increasing toehold length speeds up the reaction exponentially, as was previously observed for DNA. Introducing mismatches slows the reaction, and the closer the mismatch is to the interface of the toehold / incumbent strand, the larger the slow-down. For a six-nucleotide toehold, it was observed that RNA invading an RNA duplex is faster than RNA invading a DNA duplex. For a toehold of length 3 nucleotides, they found RNA invading DNA to be faster than RNA invading RNA.

It should be noted that these studies are just a first step towards understanding the strand displacement kinetics that involves hybrid DNA-RNA systems. Such systems are still not integrated into available simulations and the design tools that our community uses to design and test strand displacement circuits. The studies which involve invasion (of DNA or RNA) into DNA-RNA hybrid circuits have not been performed yet, and testing of effects of different sequences and positioning on the 5' or 3' end of substrate is also needed for better understanding of RNA TMSD reaction. Finally, while the thermodynamics of DNA and RNA duplexes has been carefully studied over the years, and is currently incorporated into widely used dynamic programming tools for secondary structure prediction such as NUPACK or RNAStructure, the free energies of fully complementary DNA-RNA hybrids were measured in the above work. The thermodynamics of mismatches in DNA-RNA hybrids has still not been measured.

2.5.3. Rationally designed nucleic acid nanoparticles (NANPs) with regulated immune recognition

As was revealed by the COVID-19 pandemic, there are numerous biological challenges that we are not prepared for [8,188]. Nevertheless, while the same risks still exist for many other pathogens and diseases, there is now an enormous potential available for



Fig. 12. The immunorecognition of NANPs is defined by their structure, composition, functionalization and require the use of delivery agents.

accelerated solutions that can be provided for future health threats.

With traditional small molecule drugs, there are two main components -- the dianophore that defines drug's biodistribution and pharmacokinetics, and the pharmacophore that determines its targeted function and biological responses. Therefore, even minor changes to a chemical composition of a small molecule drug can have drastic effects on its function and distribution and consequently, would require its complete re-evaluation [189]. In contrast, the separation of the dianophore and pharmacophore components yields a more modular therapeutic approach. In the case of therapeutic nucleic acids (TNAs), the backbone chemistry and the sequence define the dianophore and the pharmacophore components, respectively. This modularity allows for a tighter control over therapeutic characteristics of the drug and by changing ether chemical makeup of the backbone or the sequence of TNAs, the new therapeutic effect can be predicted and tuned as required for specific functions.

On top of being used as therapeutics, nucleic acids can now be employed as nanoscaffolds to coordinate simultaneous delivery of multiple different TNAs that are intended for synchronized action in the same diseased cell [190,191]. These nucleic acid nanoparticles, or NANPs, are rationally designed to self-assemble into specific structures [192] that gain pre-defined architectural and physicochemical parameters [193]. Furthermore, NANPs can be programmed to carry multiple functionalities embedded in their structures that all together can be activated to target multiple pathways in a particular disease.

Due to the intended applications, it becomes important to understand how NANPs interact with the human innate immune system, evolutionary equipped with the diverse set of pattern recognition receptors (PRRs) that act specifically against non-self nucleic acids. During the extensive course of systematic studies in clinically relevant model systems, several important factors responsible for NANPs' immune recognition have been discovered [6,7,192–202]. For example, carrier molecules are required for the intracellular delivery of NANPs and their immunorecognition. In addition, the carrier provides extensive protection for NANPs from degradation by nucleases and defines NANPs biodistribution. Without any carriers, all tested NANPs have been effectively invisible to the cells of the immune system. Toll-like receptors in endosomal compartments are the first line of defense against NANPs that undergo scavenger receptor mediated endocytosis and there are various mechanisms with which the immune system responds to NANPs. The recognition of NANPs by human immune cells normally activates a complex network of signaling cascades with excreted interferons being produced as key cytokines. Upon the assessment of immunostimulatory properties of a representative

set of NANPs, their dimensionality (1D, 2D, or 3D), composition (RNA vs DNA), and extend of functionalization were found to be the main contributors to the immunostimulation (Fig. 12).

Mechanistic studies helped to disseminate how NANPs can be recognized by the immune cell machinery to trigger the observed immune responses. For example, endosomal TLR7 and TLR9 and a cytosolic RIG-I have been identified to be important regulators of NANPs' immune recognition by human immune cells [193,193,196,204]. The chemical composition of NANPs also defines their interactions with PRRs as well as their localization within a cell. For example, while in the cytoplasm, some RNA made NANPs may be recognized by RIG-I and DNA hybrids with 2' fluorination can be recognized by RIG-I [196].

Overall, NANPs technology introduces a unique class of therapeutics that bring new possibilities for immunotherapies and targeted drug delivery with their structural versatilities. These particles have the potential to interact with human immune system in unique ways and, if designed correctly, can become a basis for a new class of safe and effective therapeutics. The knowledge and experience we gained by now are testimony to NANPs' potential. Further studies of how NANPs produce the observed immunological effects will pave the way for novel applications.

3. Summary of the third conference on biomotors, viral assembly and RNA nanotechnology

3.1. Meeting summary and logistics

The conference was successfully delivered over a period of four days, December 12–16, 2021, *via* the Zoom webinar platform. The first day of the conference presentations were focused on viral nanomachines and vaccines. Throughout these sessions, speakers presented their research on molecular machines and other platforms to understand viral mechanisms to produce better antiviral therapeutics including SARS- CoV-2. This day included a variety of computational and experimental results, highlighting the synergy between these two approaches to solving biochemical problems.

The second day of the conference was themed around RNA nanotechnology and therapeutics. Much of RNA's unique structural and functional properties were exhibited here. There is a tremendous effort to understand and predict the structure and function of RNA in therapeutic applications using computational methods to model RNA platforms. One of the highest barriers to overcome in RNA therapeutics is delivery into the cytoplasm. Researchers presented current carrier options and the about the search for alternative methods. Applications of RNA nanotechnology were also discussed, in particular their uses in gene therapies, diagnostics, and targeted delivery were highlighted.

Day three looked into modeling nanostructures for health and life and engineering molecular machines to mimic motor proteins. There was also significant interest in nanozymes to perform enzyme like functions for therapeutics against cancers and viral infections. The design and function of anti-cancer RNA therapies were discussed at length, including methods for effective delivery and the uses of small-interfering RNAs. It was also shown how computational modeling helps to inform the understanding and design of RNA based platforms by improving our ability to predict RNA structures and interactions.

The final day of the conference focused more heavily on biomotor imaging, nanopore sensing and DNA packaging systems. The design of nanopores for various molecular functionalities, including sequencing, was discussed, with talks highlighting the ability of nanopores to function with both proteins and nucleic acids. Methods for using nanopores to monitor reaction kinetics were also shown. DNA delivery methods into cells were discussed in depth and attendees were shown how, by utilizing molecular machines, DNA can be packaged and excreted from viruses and virus-like particles. There was also substantial attention given to the structure, functions, and mechanisms of ATPase Motors.

Lewis Rolband, Damian Beasock, Yelixza Avila, and Leyla Danai (University of North Carolina at Charlotte) moderated the conference through the assignment of presentation permissions to speakers, enforcing time requirements, transitioning between sessions, introducing session moderators and keynote speakers, and assisting with any minor technical difficulties that arose during the event.

The core mission of the International Society of RNA Nanotechnology and Nanomedicine (ISRNN) is to promote the most recent headway in RNA nanotechnology while facilitating the exchange of information and formation of interdisciplinary collaborations among researchers around the world. Founded in 2016, the society focuses heavily on the applications of RNA nanotechnologies as RNA therapeutics, biomedicines, diagnostics, and imaging. The leadership team of the ISRNN is comprised of more than 30 distinguished researchers from seven countries, with members across the globe. In order to further their primary objectives of disseminating the latest research and connecting the researchers behind these advancements, the ISRNN hosts regular conferences. In addition to the Biomotors, Viral Assembly, and RNA Nanobiotechnology conference series, the ISRNN hosts other meetings, such as their 2020 Webinar Series, which had speakers and attendees from at least 10 countries. Members of the ISRNN are given priority to organize meeting programs, speak at all meetings hosted by the society, receive discount for publications at ISRNN sponsored journals, and have access to a variety of benefits such as free RNA Nanotechnology books and privileged publications.

The 3rd Biomotors, Viral Assembly, and RNA Nanobiotechnology conference was a resounding success that brought researchers together from across the globe through a convenient online only format. This format allowed for the conference to have a much greater reach than an in-person event would have, and, as such, it brought together as many researchers as possible in these and related fields to share highlights of their most recent work and catalyzed the discussion and development of new ideas. RNA has powerful therapeutic potential; by highlighting recent advances and connecting researchers, the ISRNN hopes that RNA nanotechnology and nanomedicines can reach their full potential as quickly as possible.

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.

Acknowledgements

Y. W. and Y-G. S. thank Research Fund of Wenzhou Institute, UCAS (Grants No. WIUCASQD2020009, WIUCASQD2021043). S-J. C. thanks Dr. Yuanzhe Zhou for the help with plotting the figures. This work was supported by the National Institutes of Health under Grant R35-GM134919. Research reported in this publication was supported by the National Institute of General Medical Sciences of the National Institutes of Health under Award Number R35GM139587 (to K.A.A.). The content is solely the responsibility of the authors and does not necessarily represent the official views of the National Institutes of Health. T. S. gratefully acknowledges funding from the National Science Foundation RAPID Award 2030377 and DMS-2151777 and from the National Institutes of Health/NIGMS Award R35GM122562.

References

- [1] Chandler M, Johnson B, Khisamutdinov E, Dobrovolskaia MA, Sztuba-Solinska J, Salem AK, et al. The International Society of RNA Nanotechnology and Nanomedicine (ISRNN): The Present and Future of the Burgeoning Field. ACS Nano 2021.
- [2] Afonin KA, Dobrovolskaia MA, Ke W, Grodzinski P, Bathe M. Critical review of nucleic acid nanotechnology to identify gaps and inform a strategy for accelerated clinical translation. Adv Drug Deliv Rev 2022;181:114081.
- [3] Damase TR, Sukhovershin R, Boada C, Taraballi F, Pettigrew RI, Cooke JP. The limitless future of RNA therapeutics. Front Bioeng Biotechnol 2021;9:628137.
- [4] Afonin KA, Dobrovolskaia MA, Church G, Bathe M. Opportunities, barriers, and a strategy for overcoming translational challenges to therapeutic nucleic acid nanotechnology. ACS Nano 2020;14(8):9221–7.
- [5] Anh Lam P, Furr DP, Tran A, McKeough RQ, Beasock D, Chandler M, et al. The application of light-assisted drying to the thermal stabilization of nucleic acid nanoparticles. Biopreserv Biobanking 2022.
- [6] Chandler, M.; Jain, S.; Halman, J.; Hong, E.; Dobrovolskaia, M. A.; Zakharov, A. V.; Afonin, K. A., Artificial Immune Cell, AI-cell, a New Tool to Predict Interferon Production by Peripheral Blood Monocytes in Response to Nucleic Acid Nanoparticles. Small 2022, n/a (n/a), 2204941.
- [7] Tran AN, Chandler M, Halman J, Beasock D, Fessler A, McKeough RQ, et al. Anhydrous nucleic acid nanoparticles for storage and handling at broad range of temperatures. Small 2022;18(13):2104814.
- [8] Vishweshwaraiah, Y. L.; Hnath, B.; Rackley, B.; Wang, J.; Gontu, A.; Chandler, M.; Afonin, K. A.; Kuchipudi, S. V.; Christensen, N.; Yennawar, N. H.; Dokholyan, N. V., Adaptation-Proof SARS-CoV-2 Vaccine Design. Advanced Functional Materials 2022, n/a (n/a), 2206055.
- [9] Kefauver JM, Ward AB, Patapoutian A. Discoveries in structure and physiology of mechanically activated ion channels. Nature 2020;587(7835):567–76.
- [10] Jin P, Bulkley D, Guo Y, Zhang W, Guo Z, Huynh W, et al. Electron cryomicroscopy structure of the mechanotransduction channel NOMPC. Nature 2017;547(7661):118–22.
- [11] Wang Y, Guo Y, Li G, Liu C, Wang L, Zhang A, et al. The push-to-open mechanism of the tethered mechanosensitive ion channel NompC. Elife 2021;2021:10.
- [12] Das, R.; Lin, L.-C.; Català-Castro, F.; Malaiwong, N.; Sanfeliu-Cerdán, N.; Portade-la-Riva, M.; Pidde, A.; Krieg, M., An asymmetric mechanical code ciphers curvature-dependent proprioceptor activity. *Science Advances* 2021, 7 (38), eabg4617.
- [13] Liang C, Weitao T, Zhou L, Guo P. Translation of the long-term fundamental studies on viral DNA packaging motors into nanotechnology and nanomedicine. Sci China Life Sci 2020;63(8):1103–29.
- [14] Guo P, Zhao Z, Haak J, Wang S, Wu D, Meng B, et al. Common Mechanisms of DNA translocation motors in Bacteria and Viruses Using One-way Revolution Mechanism without Rotation. Biotechnol Adv 2014;32:853–72.
- [15] Hugel T, Michaelis J, Hetherington CL, Jardine PJ, Grimes S, Walter JM, et al. Experimental test of connector rotation during DNA packaging into bacteriophage phi29 capsids. PLoS Biol 2007;5:558–67.
- [16] De-Donatis G, Zhao Z, Wang S, Huang PL, Schwartz C, Tsodikov VO, et al. Finding of widespread viral and bacterial revolution dsDNA translocation motors distinct from rotation motors by channel chirality and size. Cell Biosci 2014;4:30.
- [17] Schwartz C, De Donatis GM, Zhang H, Fang H, Guo P. Revolution rather than rotation of AAA+ hexameric phi29 nanomotor for viral dsDNA packaging without coiling. Virology 2013;443:28–39.
- [18] Liang C, Guo P. Identification of arginine finger as the starter of the biomimetic motor in driving double-stranded DNA. ACS Nano 2021;15 (8):13260–6.
- [19] Guo P, Driver D, Zhao Z, Zheng Z, Chan C, Cheng X. Controlling the revolving and rotating motion direction of asymmetric hexameric nanomotor by arginine finger and channel chirality. ACS Nano 2019;13(6):6207–23.

L. Rolband, D. Beasock, Y. Wang et al.

- [20] Yang Y, Yang P, Wang N, Chen Z, Su D, Zhou ZH, Rao Z, Wang X. Architecture of the herpesvirus genome-packaging complex and implications for DNA translocation. Protein Cell 2020.
- [21] Jean NL, Rutherford TJ, Löwe J. FtsK in motion reveals its mechanism for double-stranded DNA translocation. Proc Natl Acad Sci U S A 2020;117 (25):14202–8.
- [22] Amado E, Muth G, Arechaga I, Cabezón E. The FtsK-like motor TraB is a DNAdependent ATPase that forms higher-order assemblies. J Biol Chem 2019;294 (13):5050–9.
- [23] Lhuillier S, Gallopin M, Gilquin B, Brasilès S, Lancelot N, Letellier G, et al. Structure of bacteriophage SPP1 head-to-tail connection reveals mechanism for viral DNA gating. Proc Natl Acad Sci 2009;106(21):8507–12.
- [24] Liu Y, Wang K, Wang Y, Wang L, Yan S, Du X, et al. Machine learning assisted simultaneous structural profiling of differently charged proteins in a mycobacterium smegmatis Porin A (MspA) electroosmotic trap. J Am Chem Soc 2022;144(2):757–68.
- [25] Tripathi P, Chandler M, Maffeo CM, Fallahi A, Makhamreh A, Halman J, et al. Discrimination of RNA fiber structures using solid-state nanopores. Nanoscale 2022;14(18):6866–75.
- [26] Boersma AJ, Bayley H. Continuous stochastic detection of amino acid enantiomers with a protein nanopore. Angew Chem Int Ed Engl 2012;51 (38):9606–9.
- [27] Ji Z, Guo P. Channel from bacterial virus T7 DNA packaging motor for the differentiation of peptides composed of a mixture of acidic and basic amino acids. Biomaterials 2019;214:119222.
- [28] Ouldali H, Sarthak K, Ensslen T, Piguet F, Manivet P, Pelta J, et al. Electrical recognition of the twenty proteinogenic amino acids using an aerolysin nanopore. Nat Biotechnol 2020;38(2):176–81.
- [29] Wang S, Zhou Z, Zhao Z, Zhang H, Haque F, Guo P. Channel of viral DNA packaging motor for real time kinetic analysis of peptide oxidation states. Biomaterials 2017;126:10–7.
- [30] Rosen CB, Rodriguez-Larrea D, Bayley H. Single-molecule site-specific detection of protein phosphorylation with a nanopore. Nat Biotechnol 2014;32(2):179–81.
- [31] Zhang L, Gardner ML, Jayasinghe L, Jordan M, Aldana J, Burns N, et al. Detection of single peptide with only one amino acid modification via electronic fingerprinting using reengineered durable channel of Phi29 DNA packaging motor. Biomaterials 2021;276:121022.
- [32] Zhou Z, Ji Z, Wang S, Haque F, Guo P. Oriented single directional insertion of nanochannel of bacteriophage SPP1 DNA packaging motor into lipid bilayer via polar hydrophobicity. Biomaterials 2016;105:222–7.
- [33] Ji Z, Jordan M, Jayasinghe L, Guo P. Insertion of channel of phi29 DNA packaging motor into polymer membrane for high-throughput sensing. Nanomedicine 2020;25:102170.
- [34] Yan S, Zhang J, Wang Y, Guo W, Zhang S, Liu Y, et al. Single Molecule Ratcheting Motion of Peptides in a Mycobacterium smegmatis Porin A (MspA) Nanopore. Nano Lett 2021;21(15):6703–10.
- [35] Zhang L, Burns N, Jordan M, Jayasinghe L, Guo P. Macromolecule sensing and tumor biomarker detection by harnessing terminal size and hydrophobicity of viral DNA packaging motor channels into membranes and flow cells. Biomater Sci 2021;10(1):167–77.
- [36] Afshar Bakshloo M, Kasianowicz JJ, Pastoriza-Gallego M, Mathe J, Daniel R, Piguet F, et al. Nanopore-Based Protein Identification. J Am Chem Soc 2022;144(6):2716-25.
- [37] Lucas FLR, Versloot RCA, Yakovlieva L, Walvoort MTC, Maglia G. Protein identification by nanopore peptide profiling, Nat Commun 2021;12(1):5795.
- [38] Wu J, Wang X, Wang Q, Lou Z, Li S, Zhu Y, et al. 2019) Nanomaterials with enzyme-like characteristics (nanozymes): next-generation artificial enzymes (II. Chem Soc Rev 2019;48(4):1004–76.
- [39] Shen X, Wang Z, Gao X, Zhao Y. Density functional theory-based method to predict the activities of nanomaterials as peroxidase mimics. ACS Catal 2020;10(21):12657–65.
- [40] Wang Z, Shen X, Gao X, Zhao Y. Simultaneous enzyme mimicking and chemical reduction mechanisms for nanoceria as a bio-antioxidant: a catalytic model bridging computations and experiments for nanozymes. Nanoscale 2019;11(28):13289–99.
- [41] Wang Z, Wu J, Zheng J-J, Shen X, Yan L, Wei H, et al. Accelerated discovery of superoxide-dismutase nanozymes via high-throughput computational screening. Nat Commun 2021;12(1):6866.
- [42] Kelly JA, Woodside MT, Dinman JD. Programmed -1 Ribosomal Frameshifting in coronaviruses: A therapeutic target. Virology 2021;554:75–82.
- [43] Dever, T. E.; Dinman, J. D.; Green, R., Translation Elongation and Recoding in Eukaryotes. Cold Spring Harb Perspect Biol 2018, 10 (8).
- [44] Halma MTJ, Ritchie DB, Woodside MT. Conformational shannon entropy of mRNA structures from force spectroscopy measurements predicts the efficiency of -1 programmed ribosomal frameshift stimulation. Phys Rev Lett 2021;126(3):038102.
- [45] Dinman JD, Wickner RB. Ribosomal frameshifting efficiency and gag/gag-pol ratio are critical for yeast M1 double-stranded RNA virus propagation. J Virol 1992;66(6):3669–76.
- [46] Hung M, Patel P, Davis S, Green SR. Importance of ribosomal frameshifting for human immunodeficiency virus type 1 particle assembly and replication. J Virol 1998;72(6):4819–24.
- [47] Plant EP, Sims AC, Baric RS, Dinman JD, Taylor DR. Altering SARS coronavirus frameshift efficiency affects genomic and subgenomic RNA production. Viruses 2013;5(1):279–94.

Computational and Structural Biotechnology Journal 20 (2022) 6120-6137

- [48] Kendra JA, de la Fuente C, Brahms A, Woodson C, Bell TM, Chen B, Khan YA, Jacobs JL, Kehn-Hall K, Dinman JD. Ablation of programmed -1 ribosomal frameshifting in venezuelan equine encephalitis virus results in attenuated neuropathogenicity. J Virol 2017;91(3).
- [49] Omar SI, Zhao M, Sekar RV, Moghadam SA, Tuszynski JA, Woodside MT. Modeling the structure of the frameshift-stimulatory pseudoknot in SARS-CoV-2 reveals multiple possible conformers. PLoS Comput Biol 2021;17(1): e1008603.
- [50] Zhang K, Zheludev IN, Hagey RJ, Haslecker R, Hou YJ, Kretsch R, et al. Cryo-EM and antisense targeting of the 28-kDa frameshift stimulation element from the SARS-CoV-2 RNA genome. Nat Struct Mol Biol 2021;28(9):747–54.
- [51] Bhatt PR, Scaiola A, Loughran G, Leibundgut M, Kratzel A, Meurs R, et al. Structural basis of ribosomal frameshifting during translation of the SARS-CoV-2 RNA genome. Science 2021;372(6548):1306–13.
- [52] Chen Y, Tao H, Shen S, Miao Z, Li L, Jia Y, et al. A drug screening toolkit based on the -1 ribosomal frameshifting of SARS-CoV-2. Heliyon 2020;6(8):e04793.
- [53] Sun, Y.; Abriola, L.; Niederer, R. O.; Pedersen, S. F.; Alfajaro, M. M.; Silva Monteiro, V.; Wilen, C. B.; Ho, Y. C.; Gilbert, W. V.; Surovtseva, Y. V.; Lindenbach, B. D.; Guo, J. U., Restriction of SARS-CoV-2 replication by targeting programmed -1 ribosomal frameshifting. *Proc Natl Acad Sci U S A* 2021, *118* (26).
- [54] Munshi, S.; Neupane, K.; Ileperuma, S. M.; Halma, M. T. J.; Kelly, J. A.; Halpern, C. F.; Dinman, J. D.; Loerch, S.; Woodside, M. T., Small-molecule ligands can inhibit –1 programmed ribosomal frameshifting in a broad spectrum of coronaviruses. 2021.
- [55] Belew AT, Hepler NL, Jacobs JL, Dinman JD. PRFdb: a database of computationally predicted eukaryotic programmed -1 ribosomal frameshift signals. BMC Genomics 2008;9:339.
- [56] Mikl M, Pilpel Y, Segal E. High-throughput interrogation of programmed ribosomal frameshifting in human cells. Nat Commun 2020;11(1):3061.
- [57] Hermann T. Small molecules targeting viral RNA. Wiley Interdiscip Rev RNA 2016;7(6):726-43.
- [58] Nguyen TM, Zhang Y, Pandolfi PP. Virus against virus: a potential treatment for 2019-nCov (SARS-CoV-2) and other RNA viruses. Cell Res 2020;30 (3):189–90.
- [59] Miao Z, Adamiak RW, Antczak M, Boniecki MJ, Bujnicki J, Chen SJ, et al. RNA-Puzzles Round IV: 3D structure predictions of four ribozymes and two aptamers. RNA 2020;26(8):982–95.
- [60] Sun LZ, Zhang D, Chen SJ. Theory and modeling of RNA structure and interactions with metal ions and small molecules. Annu Rev Biophys 2017;46:227–46.
- [61] Brierley I. Ribosomal frameshifting viral RNAs. J Gen Virol 1995;76(Pt 8):1885–92.
- [62] Atkins JF, Loughran G, Bhatt PR, Firth AE, Baranov PV. Ribosomal frameshifting and transcriptional slippage: From genetic steganography and cryptography to adventitious use. Nucleic Acids Res 2016;44(15):7007–78.
- [63] Staple DW, Butcher SE. Solution structure of the HIV-1 frameshift inducing stem-loop RNA. Nucleic Acids Res 2003;31(15):4326–31.
- [64] Brierley I, Digard P, Inglis SC. Characterization of an efficient coronavirus ribosomal frameshifting signal: requirement for an RNA pseudoknot. Cell 1989;57(4):537–47.
- [65] Somogyi P, Jenner AJ, Brierley I, Inglis SC. Ribosomal pausing during translation of an RNA pseudoknot. Mol Cell Biol 1993;13(11):6931–40.
- [66] Namy O, Moran SJ, Stuart DI, Gilbert RJ, Brierley I. A mechanical explanation of RNA pseudoknot function in programmed ribosomal frameshifting. Nature 2006;441(7090):244–7.
- [67] Ritchie DB, Foster DA, Woodside MT. Programmed -1 frameshifting efficiency correlates with RNA pseudoknot conformational plasticity, not resistance to mechanical unfolding. Proc Natl Acad Sci U S A 2012;109(40):16167–72.
- [68] Ritchie DB, Soong J, Sikkema WK, Woodside MT. Anti-frameshifting ligand reduces the conformational plasticity of the SARS virus pseudoknot. J Am Chem Soc 2014;136(6):2196–9.
- [69] Trinity, L.; Lansing, L.; Jabbari, H.; Stege, U., SARS-CoV-2 ribosomal frameshifting pseudo- knot: Improved secondary structure prediction and detection of inter-viral structural similarity. 2020.
- [70] Huston, N. C.; Wan, H.; de Cesaris Araujo Tavares, R.; Wilen, C.; Pyle, A. M., Comprehensive in-vivo secondary structure of the SARS-CoV-2 genome reveals novel regulatory motifs and mechanisms. *bioRxiv* 2020.
 [71] Lan, T. C. T.; Allan, M. F.; Malsick, L. E.; Khandwala, S.; Nyeo, S. S. Y.; Sun, Y.;
- [71] Lan, T. C. T.; Allan, M. F.; Malsick, L. E.; Khandwala, S.; Nyeo, S. S. Y.; Sun, Y.; Guo, J. U.; Bathe, M.; Griffiths, A.; Rouskin, S., Insights into the secondary structural ensembles of the full SARS-CoV-2 RNA genome in infected cells. *bioRxiv* 2021, 2020.06.29.178343.
- [72] Manfredonia I, Nithin C, Ponce-Salvatierra A, Ghosh P, Wirecki TK, Marinus T, et al. Genome-wide mapping of SARS-CoV-2 RNA structures identifies therapeutically-relevant elements. Nucleic Acids Res 2020;48 (22):12436–52.
- [73] Morandi E, Manfredonia I, Simon LM, Anselmi F, van Hemert MJ, Oliviero S, et al. Genome-scale deconvolution of RNA structure ensembles. Nat Methods 2021;18(3):249–52.
- [74] Sun L, Li P, Ju X, Rao J, Huang W, Ren L, Zhang S, Xiong T, Xu K, Zhou X, Gong M, Miska E, Ding Q, Wang J, Zhang QC. In vivo structural characterization of the SARS-CoV-2 RNA genome identifies host proteins vulnerable to repurposed drugs. Cell 2021;184(7). 1865–1883 e20.
- [75] Sanders, W.; Fritch, E. J.; Madden, E. A.; Graham, R. L.; Vincent, H. A.; Heise, M. T.; Baric, R. S.; Moorman, N. J., Comparative analysis of coronavirus genomic RNA structure reveals conservation in SARS-like coronaviruses. *bioRxiv* 2020.

- [76] Iserman C, Roden CA, Boerneke MA, Sealfon RSG, McLaughlin GA, ungreis I, et al. Genomic RNA elements drive phase separation of the SARS-CoV-2 nucleocapsid. Mol Cell 2020;80(6). 1078–1091 e6.
- [77] Andrews, R. J.; O'Leary, C. A.; Tompkins, V. S.; Peterson, J. M.; Haniff, H. S.; Williams, C.; Disney, M. D.; Moss, W. N., A map of the SARS-CoV-2 RNA structurome. NAR Genom Bioinform 2021, 3 (2), lqab043.
- [78] Ahmed F, Sharma M, Al-Ghamdi AA, Al-Yami SM, Al-Salami AM, Refai MY, et al. A comprehensive analysis of cis-acting RNA elements in the SARS-CoV-2 genome by a bioinformatics approach. Front Genet 2020;11:572702.
- [79] Dinman JD, Ruiz-Echevarria MJ, Czaplinski K, Peltz SW. Peptidyl-transferase inhibitors have antiviral properties by altering programmed -1 ribosomal frameshifting efficiencies: development of model systems. Proc Natl Acad Sci U S A 1997;94(13):6606–11.
- [80] Goss Kinzy T, Harger JW, Carr-Schmid A, Kwon J, Shastry M, Justice M, et al. New targets for antivirals: the ribosomal A-site and the factors that interact with it. Virology 2002;300(1):60–70.
- [81] Park SJ, Kim YG, Park HJ. Identification of RNA pseudoknot-binding ligand that inhibits the -1 ribosomal frameshifting of SARS-coronavirus by structure-based virtual screening. J Am Chem Soc 2011;133(26):10094–100.
- [82] Kelly JA, Olson AN, Neupane K, Munshi S, San Emeterio J, Pollack L, et al. 2020) Structural and functional conservation of the programmed -1 ribosomal frameshift signal of SARS coronavirus 2 (SARS-CoV-2. J Biol Chem 2020;295 (31):10741–8.
- [83] Haniff HS, Tong Y, Liu X, Chen JL, Suresh BM, Andrews RJ, et al. Targeting the SARS-CoV-2 RNA genome with small molecule binders and ribonuclease targeting chimera (RIBOTAC) degraders. ACS Cent Sci 2020;6(10):1713–21.
- [84] Schlick T, Zhu Q, Jain S, Yan S. Structure-altering mutations of the SARS-CoV-2 frameshifting RNA element. Biophys J 2021;120(6):1040–53.
- [85] Deigan KE, Li TW, Mathews DH, Weeks KM. Accurate SHAPE-directed RNA structure determination. Proc Natl Acad Sci U S A 2009;106(1):97–102.
- [86] Smola MJ, Weeks KM. In-cell RNA structure probing with SHAPE-MaP. Nat Protoc 2018;13(6):1181–95.
- [87] Wacker A, Weigand JE, Akabayov SR, Altincekic N, Bains JK, Banijamali E, et al. Secondary structure determination of conserved SARS-CoV-2 RNA elements by NMR spectroscopy. Nucleic Acids Res 2020;48(22):12415–35.
- [88] Rangan R, Zheludev IN, Hagey RJ, Pham EA, Wayment-Steele HK, Glenn JS, et al. RNA genome conservation and secondary structure in SARS-CoV-2 and SARS-related viruses: a first look. RNA 2020;26(8):937–59.
- [89] Ziv, O.; Price, J.; Shalamova, L.; Kamenova, T.; Goodfellow, I.; Weber, F.; Miska, E. A., The Short- and Long-Range RNA-RNA Interactome of SARS-CoV-2. *Mol Cell* 2020, 80 (6), 1067-1077 e5.
- [90] Schlick T. Molecular Modeling: An Interdisciplinary Guide. 2nd ed. New York, NY: Springer; 2010.
- [91] Schlick T. Adventures with RNA graphs. Methods 2018;2018(143):16–33.
- [92] Bayrak CS, Kim N, Schlick T. Using sequence signatures and kink-turn motifs in knowledge-based statistical potentials for RNA structure prediction. Nucleic Acids Res 2017;45(9):5414–22.
- [93] Meng G, Tariq M, Jain S, Elmetwaly S, Schlick T. RAG-Web: RNA structure prediction/design using RNA-As-Graphs. Bioinformatics 2020;36(2):647–8.
- [94] Zhu Q. Petingi L, Schlick T. RNA-As-Graphs Motif Atlas—Dual Graph Library of RNA Modules and Viral Frameshifting-Element Applications Int. J. Mol. Sci. 2022;23(16):9249. <u>https://doi.org/10.3390/ijms23169249</u>.
- [95] Chen SJ. Graph, pseudoknot, and SARS-CoV-2 genomic RNA: A biophysical synthesis. Biophys J 2021;120(6):980–2.
- [96] Schlick T, Zhu Q, Dey A, Jain S, Yan S, Laederach A. To Knot or Not to Knot: Multiple Conformations of the SARS-CoV-2 Frameshifting RNA Element. J Am Chem Soc 2021;143(30):11404–22.
- [97] Yan S, Zhu Q, Jain S, Schlick T. Length-dependent motions of SARS-CoV-2 frameshifting RNA pseudoknot and alternative conformations suggest avenues for frameshifting suppression. Nat Commun 2022;13:4284. <u>https:// doi.org/10.1038/s41467-022-31353-w</u>.
- [98] Singh J, Hanson J, Paliwal K, Zhou Y. RNA secondary structure prediction using an ensemble of two-dimensional deep neural networks and transfer learning. Nat Commun 2019;10(1):5407.
- [99] Nawrocki, E. P.; Eddy, S. R., Infernal 1.1: 100-fold faster RNA homology searches. Bioinformatics 2013, 29 (22), 2933-5.
- [100] Zhang T, Singh J, Litfin T, Zhan J, Paliwal K, Zhou Y. RNAcmap: A fully automatic pipeline for predicting contact maps of RNAs by evolutionary coupling analysis. Bioinformatics 2021.
- [101] Singh, J.; Paliwal, K.; Zhang, T.; Singh, J.; Litfin, T.; Zhou, Y., Improved RNA Secondary Structure and Tertiary Base-pairing Prediction Using Evolutionary Profile, Mutational Coupling and Two-dimensional Transfer Learning. *Bioinformatics* 2021.
- [102] J. Singh, K. P., T. Litfin, J. Singh, and Y. Zhou, Predicting RNA distance-based contact maps by integrated deep learning on physics-inferred secondary structure and evolutionary-derived mutational coupling. *submitted* (2022) 2022.
- [103] Singh J, Paliwal K, Singh J, Zhou Y. RNA backbone torsion and pseudotorsion angle prediction using dilated convolutional neural networks. J Chem Inf Model 2021;61(6):2610–22.
- [104] Hanumanthappa AK, Singh J, Paliwal K, Singh J, Zhou Y. Single-sequence and profile-based prediction of RNA solvent accessibility using dilated convolutional neural network. Bioinformatics 2021;36(21):5169–76.
- [105] Xiong P, Wu R, Zhan J, Zhou Y. Pairing a high-resolution statistical potential with a nucleobase-centric sampling algorithm for improving RNA model refinement. Nat Commun 2021;12(1):2777.

- [106] Townshend RJL, Eismann S, Watkins AM, Rangan R, Karelina M, Das R, et al. Geometric deep learning of RNA structure. Science 2021;373(6558):1047–51.
- [107] Ganser LR, Kelly ML, Herschlag D, Al-Hashimi HM. The roles of structural dynamics in the cellular functions of RNAs. Nat Rev Mol Cell Biol 2019;20 (8):474–89.
- [108] Yesselman JD, Eiler D, Carlson ED, Gotrik MR, d'Aquino AE, Ooms AN, et al. Computational design of three-dimensional RNA structure and function. Nat Nanotechnol 2019;14(9):866–73.
- [109] Westhof E, Masquida B, Jaeger L. RNA tectonics: towards RNA design. Fold Des 1996;1(4):R78–88.
- [110] Jaafar ZA, Kieft JS. Viral RNA structure-based strategies to manipulate translation. Nat Rev Microbiol 2019;17(2):110–23.
- [111] Twarock R, Bingham RJ, Dykeman EC, Stockley PG. A modelling paradigm for RNA virus assembly. Curr Opin Virol 2018;31:74–81.
- [112] Twarock R, Stockley PG. RNA-mediated virus assembly: mechanisms and consequences for viral evolution and therapy. Annu Rev Biophys 2019;48 (1):495–514.
- [113] Tetter S, Terasaka N, Steinauer A, Bingham RJ, Clark S, Scott AJP, et al. Evolution of a virus-like architecture and packaging mechanism in a repurposed bacterial protein. Science 2021;372(6547):1220–4.
- [114] Dreher TW. Role of tRNA-like structures in controlling plant virus replication. Virus Res 2009;139(2):217–29.
- [115] Dreher TW. Viral tRNAs and tRNA-like structures. Wiley Interdiscip Rev RNA 2010;1(3):402–14.
- [116] Bonilla SL, Sherlock ME, MacFadden A, Kieft JS. A viral RNA hijacks host machinery using dynamic conformational changes of a tRNA-like structure. Science 2021;374(6570):955–60.
- [117] Merino EJ, Wilkinson KA, Coughlan JL, Weeks KM. RNA structure analysis at single nucleotide resolution by selective 2'-hydroxyl acylation and primer extension (SHAPE. J Am Chem Soc 2005;127(12):4223–31.
- [118] Chandler-Bostock, R.; Bingham, R. J.; Clark, S.; Scott, A. J. P.; Wroblewski, E.; Barker, A.; White, S. J.; Dykeman, E. C.; Mata, C. P.; Bohon, J.; Farquhar, E.; Twarock, R.; Stockley, P. G., RNA X-ray footprinting reveals the consequences of an in vivo acquired determinant of viral infectivity. *bioRxiv* 2021, 2021.08.10.455819.
- [119] Hurst T, Xu X, Zhao P, Chen SJ. (2018) Quantitative Understanding of SHAPE Mechanism from RNA Structure and Dynamics Analysis. J Phys Chem B 2018;122(18):4771–83.
- [120] Hurst T, Chen SJ. Sieving RNA 3D Structures with SHAPE and Evaluating Mechanisms Driving Sequence-Dependent Reactivity Bias. J Phys Chem B 2021;125(4):1156–66.
- [121] Zhou Y, Li J, Hurst T, Chen SJ. SHAPER: A web server for fast and accurate SHAPE reactivity prediction. Front Mol Biosci 2021;8:721955.
- [122] Cao S, Giedroc DP, Chen SJ. Predicting loop-helix tertiary structural contacts in RNA pseudoknots. RNA 2010;16(3):538–52.
- [123] Li J, Chen SJ. RNA 3D structure prediction using coarse-grained models. Front Mol Biosci 2021;8:720937.
- [124] Zhang D, Chen SJ. IsRNA: an iterative simulated reference state approach to modeling correlated interactions in RNA folding. J Chem Theory Comput 2018;14(4):2230–9.
- [125] Zhang D, Li J, Chen SJ. IsRNA1: de novo prediction and blind screening of RNA 3D structures. J Chem Theory Comput 2021;17(3):1842–57.
- [126] Zhang D, Chen SJ, Zhou R. Modeling noncanonical RNA base pairs by a coarsegrained IsRNA2 model. J Phys Chem B 2021;125(43):11907–15.
- [127] Cao S, Chen SJ. Free energy landscapes of RNA/RNA complexes: with applications to snRNA complexes in spliceosomes. J Mol Biol 2006;357 (1):292–312.
- [128] Cao S, Chen SJ. Structure and stability of RNA/RNA kissing complex: with application to HIV dimerization initiation signal. RNA 2011;17 (12):2130-43.
- [129] Zhang X, Xu X, Yang Z, Burcke AJ, Gates KS, Chen SJ, et al. Mimicking Ribosomal Unfolding of RNA Pseudoknot in a Protein Channel. J Am Chem Soc 2015;137(50):15742–52.
- [130] Zhang X, Zhang D, Zhao C, Tian K, Shi R, Du X, et al. Nanopore electric snapshots of an RNA tertiary folding pathway. Nat Commun 2017;8(1):1458.
- [131] Sun TT, Zhao C, Chen SJ. Predicting cotranscriptional folding kinetics for riboswitch. J Phys Chem B 2018;122(30):7484–96.
- [132] Zhao P, Zhang W, Chen SJ. Cotranscriptional folding kinetics of ribonucleic acid secondary structures. J Chem Phys 2011;135(24):245101.
- [133] Sun LZ, Jiang Y, Zhou Y, Chen SJ. RLDOCK: A New Method for Predicting RNA-Ligand Interactions. J Chem Theory Comput 2020;16(11):7173–83.
- [134] Jiang Y, Chen SJ. RLDOCK method for predicting RNA-small molecule binding modes. Methods 2022;197:97–105.
- [135] Zhou YZ, Jiang YW, Chen SJ. RNA-ligand molecular docking: Advances and challenges. Wires Comput Mol Sci 2021.
- [136] Hurst T, Zhou Y, Chen S-J. Analytical modeling and deep learning approaches to estimating RNA SHAPE reactivity from 3D structure. Communications in Information and Systems 2019;19(3):299–319.
- [137] Chen Y, Pollack L. SAXS studies of RNA: structures, dynamics, and interactions with partners. Wiley Interdiscip Rev RNA 2016;7(4):512–26.
- [138] Oliver, R. C.; Rolband, L. A.; Hutchinson-Lundy, A. M.; Afonin, K. A.; Krueger, J. K. Small-Angle Scattering as a Structural Probe for Nucleic Acid Nanoparticles (NANPs) in a Dynamic Solution Environment *Nanomaterials* [Online], 2019.
- [139] Sponer J, Bussi G, Krepl M, Banas P, Bottaro S, Cunha RA, et al. RNA structural dynamics as captured by molecular simulations: A comprehensive overview. Chem Rev 2018;118(8):4177–338.

L. Rolband, D. Beasock, Y. Wang et al.

- [140] Rozycki B, Kim YC, Hummer G, SAXS ensemble refinement of ESCRT-III CHMP3 conformational transitions. Structure 2011;19(1):109-16.
- [141] Kofinger J, Hummer G. Atomic-resolution structural information from scattering experiments on macromolecules in solution. Phys Rev E Stat Nonlin Soft Matter Phys 2013;87(5):052712.
- [142] Chen PC, Hub JS. Validating solution ensembles from molecular dynamics simulation by wide-angle X-ray scattering data. Biophys J 2014;107 (2):435-47.[143] Mlynsky V, Bussi G. Exploring RNA structure and dynamics through
- enhanced sampling simulations. Curr Opin Struct Biol 2018;49:63-71.
- [144] Bernetti M, Hall KB, Bussi G. Reweighting of molecular simulations with explicit-solvent SAXS restraints elucidates ion-dependent RNA ensembles. Nucleic Acids Res 2021;49(14):e84.
- [145] Welty R, Pabit SA, Katz AM, Calvey GD, Pollack L, Hall KB. Divalent ions tune the kinetics of a bacterial GTPase center rRNA folding transition from secondary to tertiary structure. RNA 2018;24(12):1828-38.
- [146] Bussi G, Laio A. Using metadynamics to explore complex free-energy landscapes. Nature Reviews Physics 2020;2(4):200-12.
- [147] Paissoni C, Jussupow A, Camilloni C. Martini bead form factors for nucleic acids and their application in the refinement of protein-nucleic acid complexes against SAXS data. J Appl Crystallogr 2019;52(2):394–402.
- [148] Cesari A, Reißer S, Bussi G. Using the maximum entropy principle to combine simulations and solution experiments. Computation 2018;6(1).
- [149] He, W.; Chen, Y.-L.; Pollack, L.; Kirmizialtin, S., The structural plasticity of nucleic acid duplexes revealed by WAXS and MD. Sci Adv 7 (17), eabf6106.
- [150] Wang Y, Lamim Ribeiro JM, Tiwary P. Machine learning approaches for analyzing and enhancing molecular dynamics simulations. Curr Opin Struct Biol 2020;61:139-45.
- [151] Šponer J, Bussi G, Krepl M, Banáš P, Bottaro S, Cunha RA, et al. RNA structural dynamics as captured by molecular simulations: A comprehensive overview. Chem Rev 2018;118(8):4177-338.
- [152] Binzel DW, Khisamutdinov EF, Guo P. Entropy-driven one-step formation of Phi29 pRNA 3WJ from three RNA fragments. Biochemistry 2014;53 (14):2221-31.
- [153] Hall KB. RNA in motion. Curr Opin Chem Biol 2008;12(6):612-8.
- [154] Hansen AL, Al-Hashimi HM. Dynamics of large elongated RNA by NMR carbon relaxation. | Am Chem Soc 2007;129(51):16072-82.
- [155] Sun X, Zhang Q, Al-Hashimi HM. Resolving fast and slow motions in the internal loop containing stem-loop 1 of HIV-1 that are modulated by Mg2+ binding: role in the kissing-duplex structural transition. Nucleic Acids Res 2007;35(5):1698-713.
- [156] Zhang Q, Stelzer AC, Fisher CK, Al-Hashimi HM. Visualizing spatially correlated dynamics that directs RNA conformational transitions. Nature 2007;450(7173):1263-7.
- [157] Zhang Q, Sun X, Watt ED, Al-Hashimi HM. Resolving the motional modes that code for RNA adaptation. Science 2006;311(5761):653-6.
- [158] Ferner J, Villa A, Duchardt E, Widjajakusuma E, Wöhnert J, Stock G, et al. NMR and MD studies of the temperature-dependent dynamics of RNA YNMGtetraloops. Nucleic Acids Res 2008;36(6):1928-40.
- [159] Ilin S, Hoskins A, Ohlenschläger O, Jonker HR, Schwalbe H, Wöhnert J. Domain reorientation and induced fit upon RNA binding: solution structure and dynamics of ribosomal protein L11 from Thermotoga maritima. ChemBioChem 2005;6(9):1611–8.
- [160] Isambert H. The jerky and knotty dynamics of RNA. Methods 2009;49 (2):189-96.
- [161] Al-Hashimi HM, Walter NG. RNA dynamics: it is about time. Curr Opin Struct Biol 2008;18(3):321-9.
- [162] Larsen, K. P.; Choi, J.; Prabhakar, A.; Puglisi, E. V.; Puglisi, J. D., Relating Structure and Dynamics in RNA Biology. Cold Spring Harb Perspect Biol 2019, 11(7)
- [163] Chan Y. Haverkamp RG. Hill IM. Force-extension formula for the worm-like chain model from a variational principle. J Theor Biol 2010;262(3):498–504.
- [164] Li X, Bhullar AS, Binzel DW, Guo P. The dynamic, motile and deformative properties of RNA nanoparticles facilitate the third milestone of drug development. Adv Drug Deliv Rev 2022;186:114316.
- [165] Ding J, Swain M, Yu P, Stagno JR, Wang YX. Conformational flexibility of adenine riboswitch aptamer in apo and bound states using NMR and an X-ray free electron laser. J Biomol NMR 2019;73(8-9):509-18.
- [166] Spitale RC, Wedekind JE. Exploring ribozyme conformational changes with Xray crystallography. Methods 2009;49(2):87-100.
- [167] Kim H, Abeysirigunawarden SC, Chen K, Mayerle M, Ragunathan K, Luthey-Schulten Z, et al. Protein-guided RNA dynamics during early ribosome assembly. Nature 2014;506(7488):334-8.
- [168] Voith von Voithenberg, L.; Sánchez-Rico, C.; Kang, H. S.; Madl, T.; Zanier, K.; Barth, A.; Warner, L. R.; Sattler, M.; Lamb, D. C., Recognition of the 3' splice site RNA by the U2AF heterodimer involves a dynamic population shift. Proc Natl Acad Sci U S A 2016, 113 (46), E7169-e7175.
- [169] Lee D, Walsh JD, Yu P, Markus MA, Choli-Papadopoulou T, Schwieters CD, et al. The structure of free L11 and functional dynamics of L11 in free, L11rRNA(58 nt) binary and L11-rRNA(58 nt)-thiostrepton ternary complexes. J Mol Biol 2007;367(4):1007-22.
- [170] Mitra K, Frank J. Ribosome dynamics: insights from atomic structure modeling into cryo-electron microscopy maps. Annu Rev Biophys Biomol Struct 2006;35:299-317.

Computational and Structural Biotechnology Journal 20 (2022) 6120-6137

- [171] Ghimire C, Wang H, Li H, Vieweger M, Xu C, Guo P. RNA nanoparticles as rubber for compelling vessel extravasation to enhance tumor targeting and for fast renal excretion to reduce toxicity. ACS Nano 2020;14(10):13180-91.
- [172] Li H, Zhang K, Binzel DW, Shlyakhtenko LS, Lyubchenko YL, Chiu W, et al. RNA nanotechnology to build a dodecahedral genome of single-stranded RNA virus. RNA Biol 2021;18(12):2390-400.
- [173] Nazim Uddin M, Kim JY. Intercellular and systemic spread of RNA and RNAi in plants. Wiley Interdiscip Rev RNA 2013;4(3):279-93.
- [174] Haimovich G, Ecker CM, Dunagin MC, Eggan E, Raj A, Gerst JE, et al. Intercellular mRNA trafficking via membrane nanotube-like extensions in mammalian cells. Proc Natl Acad Sci U S A 2017;114(46):E9873-82.
- [175] Melnyk CW, Molnar A, Baulcombe DC. Intercellular and systemic movement of RNA silencing signals. Embo j 2011;30(17):3553-63.
- [176] Homan PJ, Favorov OV, Lavender CA, Kursun O, Ge X, Busan S, et al. Singlemolecule correlated chemical probing of RNA. Proc Natl Acad Sci U S A 2014;111(38):13858-63.
- Puglisi JD, Wyatt JR, Tinoco I, Jr.. Conformation of an RNA pseudoknot. J Mol [177] Biol 1990;214(2):437-53.
- [178] Williamson JR. Induced fit in RNA-protein recognition. Nat Struct Biol 2000;7 (10):834-7.
- [179] Kudla G, Wan Y, Helwak A. RNA conformation capture by proximity ligation. Annu Rev Genomics Hum Genet 2020;21:81-100.
- [180] Andronescu M, Condon A, Turner DH, Mathews DH. The determination of RNA folding nearest neighbor parameters. Methods Mol 2014;1097:45-70.
- [181] Robertson, M. P.; Joyce, G. F., The origins of the RNA world. Cold Spring Harb Perspect Biol 2012, 4 (5).
- [182] Guo P. The emerging field of RNA nanotechnology. Nat Nanotechnol 2010;5 (12):833-42.
- [183] Ke W, Chandler M, Cedrone E, Saito RF, Rangel MC, de Souza Junqueira M, et al. Locking and unlocking thrombin function using immunoquiescent nucleic acid nanoparticles with regulated retention in vivo. Nano Lett 2022;22(14):5961-72.
- [184] Hong F, Sulc P. An emergent understanding of strand displacement in RNA biology. | Struct Biol 2019;207(3):241-9.
- [185] Srinivas N, Ouldridge TE, Sulc P, Schaeffer JM, Yurke B, Louis AA, et al. On the biophysics and kinetics of toehold-mediated DNA strand displacement. Nucleic Acids Res 2013;41(22):10641-58.
- [186] Liu H, Hong F, Smith F, Goertz J, Ouldridge T, Stevens MM, et al. Kinetics of RNA and RNA:DNA Hybrid Strand Displacement. ACS Synth Biol 2021;10 (11):3066-73.
- [187] Sulc P, Ouldridge TE, Romano F, Doye JP, Louis AA. Modelling toeholdmediated RNA strand displacement. Biophys J 2015;108(5):1238-47.
- [188] Panigaj M, Dobrovolskaia MA, Afonin KA. 2021: an immunotherapy odyssey and the rise of nucleic acid nanotechnology. Nanomedicine (Lond) 2021;16 (19):1635-40.
- [189] Johnson MB, Chandler M, Afonin KA. Nucleic acid nanoparticles (NANPs) as molecular tools to direct desirable and avoid undesirable immunological effects. Adv Drug Deliv Rev 2021;173:427-38.
- [190] Saito RF, Rangel MC, Halman JR, Chandler M, de Sousa Andrade LN, Odete-Bustos S, et al. Simultaneous silencing of lysophosphatidylcholine acyltransferases 1–4 by nucleic acid nanoparticles (NANPs) improves radiation response of melanoma cells. Nanomedicine 2021;36:102418.
- [191] Afonin KA, Viard M, Koyfman AY, Martins AN, Kasprzak WK, Panigaj M, et al. Multifunctional RNA nanoparticles. Nano Lett 2014;14(10):5662-71.
- [192] Afonin KA, Kasprzak WK, Bindewald E, Kireeva M, Viard M, Kashlev M, et al. In silico design and enzymatic synthesis of functional RNA nanoparticles. Acc Chem Res 2014;47(6):1731-41.
- [193] Hong E, Halman JR, Shah AB, Khisamutdinov EF, Dobrovolskaia MA, Afonin KA. Structure and composition define immunorecognition of nucleic acid nanoparticles. Nano Lett 2018;18(7):4309-21.
- [194] Avila YI, Chandler M, Cedrone E, Newton HS, Richardson M, Xu J, et al. Induction of cytokines by nucleic acid nanoparticles (NANPs) depends on the type of delivery carrier. Molecules 2021;26(3):652.
- [195] Dobrovolskaia MA, Afonin KA. Use of human peripheral blood mononuclear cells to define immunological properties of nucleic acid nanoparticles. Nat Protoc 2020:15(11):3678-98
- [196] Johnson, M. B.; Halman, J. R.; Miller, D. K.; Cooper, J. S.; Khisamutdinov, F., Emil; Marriott, I.; Afonin, K. A., The immunorecognition, subcellular compartmentalization, and physicochemical properties of nucleic acid nanoparticles can be controlled by composition modification. Nucleic Acids Research 2020, 48 (20), 11785-11798.
- [197] Ke W, Hong E, Saito RF, Rangel MC, Wang J, Viard M, et al. RNA-DNA fibers and polygons with controlled immunorecognition activate RNAi, FRET and transcriptional regulation of NF-kappaB in human cells. Nucleic Acids Res 2019:47(3):1350-61.
- [198] Rackley L, Stewart JM, Salotti J, Krokhotin A, Shah A, Halman JR, et al. RNA fibers as optimized nanoscaffolds for siRNA coordination and reduced immunological recognition. Adv Funct Mater 2018;28(48).
- [199] Halman JR, Satterwhite E, Roark B, Chandler M, Viard M, Ivanina A, et al. Functionally-interdependent shape-switching nanoparticles with controllable properties. Nucleic Acids Res 2017;45(4):2210-20.
- [200] Johnson MB, Halman JR, Satterwhite E, Zakharov AV, Bui MN, Benkato K, et al. Programmable nucleic acid based polygons with controlled

Computational and Structural Biotechnology Journal 20 (2022) 6120-6137

neuroimmunomodulatory properties for predictive QSAR modeling. Small 2017;13(42).

- (2017):13(42).
 (201) Chandler M, Rolband L, Johnson MB, Shi D, Avila YI, Cedrone E, et al. Expanding structural space for immunomodulatory nucleic acid nanoparticles via spatial arrangement of their therapeutic moieties. Adv Funct Mater 2022;32(43):2205581.
 (2021) Funct Mater 2022;32(43):2205581.
- [202] Zhovmer AS, Chandler M, Manning A, Afonin KA, Tabdanov ED. Programmable DNA-augmented hydrogels for controlled activation of human lymphocytes. Nanomedicine 2021;37.
- [203] Chandler M, Minevich B, Roark B, Viard M, Johnson MB, Rizvi MH, et al. Controlled organization of inorganic materials using biological molecules for activating therapeutic functionalities. ACS Appl Mater Interfaces 2021;13 (33):39030–41.
- [204] Hong E, Halman JR, Shah A, Cedrone E, Truong N, Afonin KA, Dobrovolskaia MA. Toll-like receptor-mediated recognition of nucleic acid nanoparticles (NANPs) in human primary blood cells. Molecules 2019;24(6).