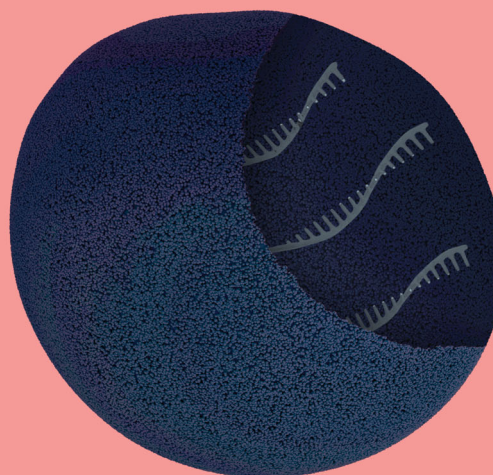
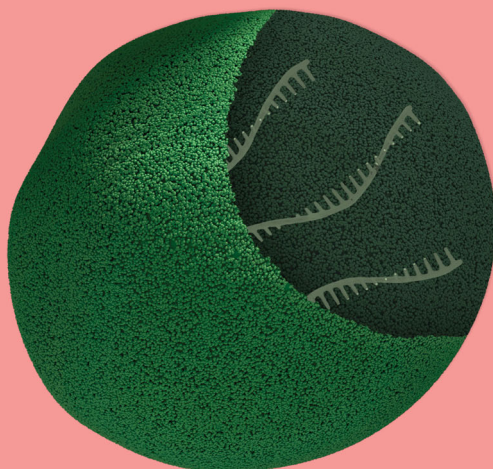
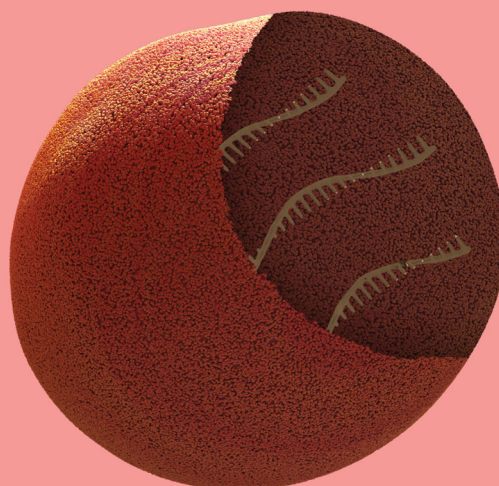
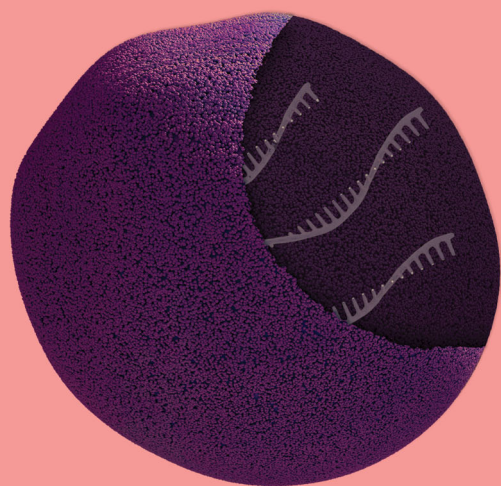


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Barcoding chemical modifications into nucleic acids improves drug stability *in vivo*

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The efficacy of nucleic acid therapies can be limited by unwanted degradation. Chemical modifications are known to improve nucleic acid stability, but the (i) types, (ii) positions, and (iii) numbers of modifications all matter, making chemically optimizing nucleic acids a combinatorial problem. As a result, *in vivo* studies of nucleic acid stability are time consuming and expensive. We reasoned that DNA barcodes could simultaneously study how chemical modification patterns affect nucleic acid stability, saving time and resources. We confirmed that rationally designed DNA barcodes can elucidate the role of specific chemical modifications in serum, *in vitro* and *in vivo*; we also identified a modification pattern that enhanced stability. This approach to screening chemical modifications *in vivo* can efficiently optimize nucleic acid structure, which will improve biomaterial-based nucleic acid drugs.

Introduction

Nucleic acids are therapeutic biomolecules that can be used to specifically manipulate genes in patients.¹ There are 2 significant problems that slow the development of nucleic acid therapies. First, systemic delivery to non-hepatocyte cell types remains a significant challenge.² As a result, high doses of drugs must be administered, which can cause off-target effects. Second, the nucleic acid can activate the immune system and be degraded. Nucleic acids trigger cellular sensors (*e.g.* TLRs, RIG-I), and are degraded by nucleases in serum and in cells. Nucleic acid degradation occurs through multiple mechanisms, most notably endonucleases, exonucleases, and hydrolysis. Endonucleases can cleave nucleic acids in either random or a sequence-defined manner and often are active against double-stranded nucleic acid regions. Exonucleases can degrade from single or double stranded nucleic acid termini in the 3' or 5' directions; it has been postulated that 3'-exonucleases are the primary cause of nucleic acid degradation in serum and plasma.^{3,4} However, 5' exonuclease activity has been observed against exogenous⁴ and endogenous nucleic acids.⁵ Taken together, these 2 limitations mean potential nucleic acid drugs need to be frequently administered at high doses; this makes them impractical.

Chemical modifications are used to increase nucleic acid stability by preventing nuclease degradation and immunostimulation. Although there are many different chemical modifications, they

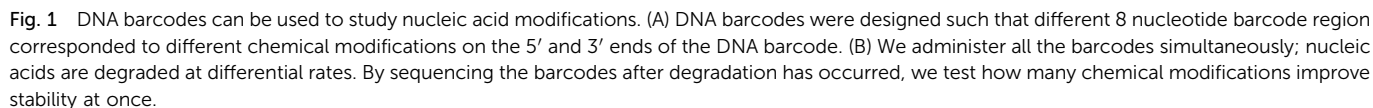
can roughly be subdivided into modifications to the ribose (most often on the 2' position) and modifications to the phosphodiester backbone. We set out to study how 2 commonly used chemical modifications to the 2'-ribose (2'-*O*-methyl) and phosphodiester linkage (phosphorothioates) enhance DNA stability. 2'-*O*-Methyl and phosphorothioates modifications are commonly used to enhance the biological efficacy of nucleic acids including siRNA,⁶ anti-sense oligonucleotides,⁷ DNA repair templates,⁸ CRISPR-Cas9⁹⁻¹¹ sgRNAs, and Cpf1 crRNAs,¹² and DNA origami.¹³ However, the (i) number, (ii) location, and (iii) type of chemical modifications affect nucleic acid stability; this makes optimizing the chemical structure a combinatorial problem. How these 3 variables interact with one another is unknown; for example, do the (i) number of ideal modifications stays consistent regardless of the (iii) type of modifications? An ideal approach would entail testing all possible chemical modification patterns 1 by 1. However, this approach would be expensive and time consuming, particularly if the studies are performed *in vivo*. One unexplored alternative is to use a DNA barcode to test several chemical modification patterns simultaneously. DNA barcodes have been used to study cell lineage,¹⁴ resistance to cancer drugs,^{15,16} primary tumor growth,^{17,18} metastasis,¹⁹ viral delivery,²⁰ and nanoparticle targeting.²¹⁻²³ However, whether DNA barcoding can be used to optimize chemical modifications remains unexplored.

Results

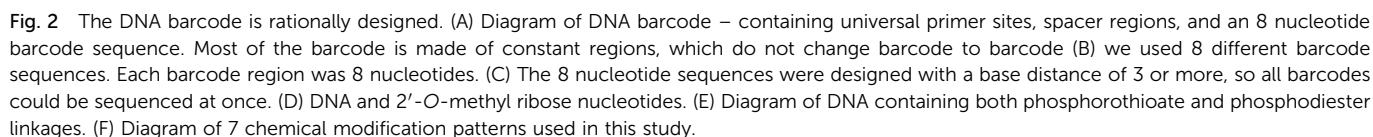
We hypothesized that rationally designed DNA barcodes could be used for high throughput studies of nucleic acid modifications. To test this hypothesis, we reengineered a DNA barcoding system

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We rationally designed the barcode sequence for these studies (Fig. 2A). Briefly, each DNA sequence was identical except for 2 locations: the chemical modifications at the termini, and the DNA barcode region – which was used as the tag for that chemical modification pattern – in the middle. The ‘barcode region’ was only 8 nucleotides; this can generate 65 536 (4^8) different barcode sequences. Of these 65 536 sequences, we selected 8 sequences with a base distance of 3 or more (Fig. 2B); in other words, every barcode was different from all other barcodes at 3 of the 8 positions (or more) (Fig. 2C). Using an Illumina QC score of 30, this ensures the odds of the sequencing calling a ‘false’ barcode is less than $1/10^9$. We have designed an additional 150 sequences with base distances of 3 or more. Flanking these variable



At each time point in the serum incubation time course the most heavily modified sequence – with 5 2-*O*-methyl and 5 phosphorothioate modifications on both the 5' and 3' termini – resisted degradation more than other barcodes (Fig. 3A–C). After 24 hours of incubations, the barcodes with 5 2-*O*-methyl and 5 phosphorothioate modifications were enriched by 7.7 fold, relative to the unmodified barcode; after 1 hour, enrichment was only 2 fold. DNA barcodes with just 5 phosphorothioate modifications also tended to outperform other modifications. At the 24 hour timepoint, the barcode with just 5 phosphorothioate modifications were enriched by 4.8 fold. Several control conditions that led us to believe the data were robust. First, barcodes with other modifications were not enriched relative to the control. In addition, when we added the barcodes to PBS – which should not degrade the barcodes – no enrichment was observed (Fig. 3D). Finally, we observed that the enrichment of the barcodes with either 5 2-*O*-methyl and 5 phosphorothioates and the barcodes with just 5 phosphorothioates increased with time (Fig. 3E), which we would expect if the other barcodes were being degraded.

A Bar chart showing fold enrichment of 5hmC in the ES cell genome at 1 hr. The y-axis is 'Fold Enrichment (vs. no mods)' ranging from 0 to 3. The x-axis categories are 5Ome 5PS, 5Ome, 5PS, 3Ome 3PS, 3Ome, 3PS, and none. The 5Ome 5PS condition shows a significant increase (marked with *).

Condition	Fold Enrichment (vs. no mods)
5Ome 5PS	~2.1*
5Ome	~0.9
5PS	~1.5
3Ome 3PS	~1.2
3Ome	~1.4
3PS	~1.2
none	~1.0

B Bar chart showing fold enrichment of 5hmC in the ES cell genome at 3 hrs. The y-axis is 'Fold Enrichment (vs. no mods)' ranging from 0 to 3. The x-axis categories are 5PS / 5Ome, 5Ome, 5PS, 3PS / 3Ome, 3Ome, 3PS, and no mods. The 5PS / 5Ome and 5PS conditions show significant increases (marked with *).

Condition	Fold Enrichment (vs. no mods)
5PS / 5Ome	~2.7*
5Ome	~0.9
5PS	~1.9*
3PS / 3Ome	~1.0
3Ome	~1.1
3PS	~0.9
no mods	~1.0

C Bar chart showing fold enrichment of 5hmC in the ES cell genome at 24 hrs. The y-axis is 'Fold Enrichment (vs. no mods)' ranging from 0 to 10. The x-axis categories are 5PS / 5Ome, 5Ome, 5PS, 3PS / 3Ome, 3Ome, 3PS, and no mods. The 5PS / 5Ome and 5PS conditions show significant increases (marked with *).

Condition	Fold Enrichment (vs. no mods)
5PS / 5Ome	~7.8*
5Ome	~1.5
5PS	~4.8*
3PS / 3Ome	~0.5
3Ome	~0.6
3PS	~1.0
no mods	~1.1

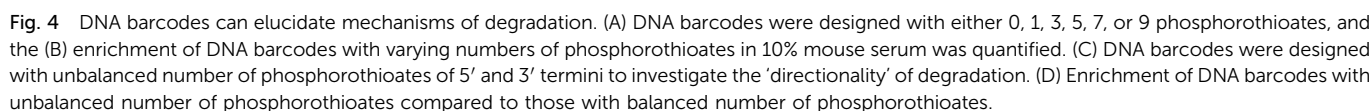
D Bar chart showing fold enrichment of 5hmC in the ES cell genome in the presence of PBS. The y-axis is 'Fold Enrichment (vs. no mods)' ranging from 0 to 3. The x-axis categories are 5PS / 5Ome, 5Ome, 5PS, 3PS / 3Ome, 3Ome, 3PS, and none. All conditions show fold enrichment near 1.0.

Condition	Fold Enrichment (vs. no mods)
5PS / 5Ome	~1.0
5Ome	~0.8
5PS	~0.8
3PS / 3Ome	~0.7
3Ome	~0.9
3PS	~0.9
none	~1.0

E Line graph showing enrichment of 5hmC in the ES cell genome over time (0.5 to 32 hours) for various conditions. The y-axis is 'Enrichment (vs. no mods)' ranging from 0 to 10. The x-axis is 'Time (Hours)' on a log scale. The legend indicates: 5Ome 5PS (dark blue), 5PS (light blue), 3Ome 3PS (green), 3PS (red), 5Ome (grey), 3Ome (light grey), and none (black). The 5Ome 5PS condition shows a significant increase over time, reaching ~7.8 at 32 hours.

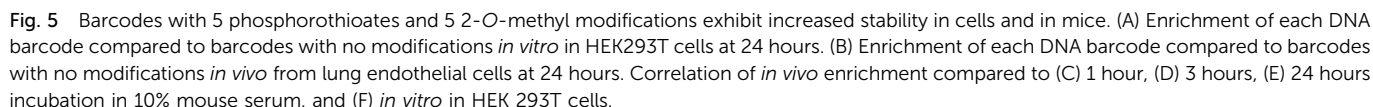
Time (Hours)	5Ome 5PS	5PS	3Ome 3PS	3PS	5Ome	3Ome	none
1	~2.1	~1.5	~1.0	~1.0	~1.0	~1.0	~1.0
3	~2.7	~1.9	~1.0	~1.0	~1.0	~1.0	~1.0
32	~7.8	~4.8	~1.0	~1.0	~1.0	~1.0	~1.0

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In these initial serum experiments, we observed that barcodes containing 3 phosphorothioate or 3 2-*O*-methyl modifications were not enriched, compared to unmodified control barcodes. However, our results were in generated serum, which may not

We investigated whether serum or *in vitro* conditions accurately predicted nucleic acid degradation *in vivo*. Specifically, we quantified the R^2 coefficient between the enrichment for in the *in vivo* experiment and serum or *in vitro* experiments. We found that



‘minimally sufficient’ number to prevent nucleic acid degradation. It will be interesting to study this ‘minimal’ number in different physiological conditions and disease states. Notably, DNA barcodes with 0, 2, and 3 phosphorothioate modifications have been successfully applied *in vivo* for the study of the impact of chemotherapeutics²³ and nanoparticle biodistribution.²¹ This work can inform the design of future DNA barcodes with increased stability *in vivo*. One important limitation is that we did not study additional chemical modifications (*e.g.* 2'-fluoro, 2'-*O*-methoxyethyl), as well as non-natural bases. We foresee future studies to understand the nuclease stability of additional chemical modifications. More generally, we believe these data demonstrate that DNA barcodes can be used to study many modifications at once. We anticipate future studies utilizing this platform to study how modifications affect the biodistribution of nucleic acid drugs, including those delivered by biomaterials for targeted genetic therapeutics *in vivo*.

Materials and methods

91 or 95 nucleotide single stranded DNA sequences were purchased as ultramers from Integrated DNA Technologies (IDT). Barcodes were designed with either zero, three, or five nucleotides on the 5' and 3' ends were modified with phosphorothioate linkages and 2'-O-methyl modifications to reduce exonuclease degradation and improve DNA barcode stability. To ensure equal amplification of

each sequence, the we included universal forward and reverse primer regions on all barcodes. Each barcode was distinguished using a unique 8nt sequence. An 8nt sequence can generate over 4^8 (65 536) distinct barcodes. We used 8nt sequences designed by to prevent sequence bleaching on the Illumina sequencing machine.

Mouse serum degradation assay

Normal Mouse Serum (ThermoFisher) was diluted to 10.75% in $1 \times$ PBS and 93 μ L of 10.75% Mouse Serum was aliquoted into sterile, DNase-free eppendorfs. 7 μ L of 100 μ M DNA barcode mixture was added to each tube and immediately placed on a heated shaker block at 37 °C for either 1, 3, or 24 hours. At the respective timepoint, the tube was immediately frozen and stored at to -20 °C for future analysis.

In vitro transfection

In vitro experiments were performed using HEK293T cells cultured in DMEM/F-12 50/50 media (Corning) supplemented by 10% (v/v) FBS (VWR) and 1% (v/v) penicillin–streptomycin (VWR). Cells were seeded in a 6-well plate at a density of 300k cells per well. 24 hours later, DNA barcode mixture and Lipofectamine 2000 (ThermoFisher) were added with a total DNA dose of 100 ng per well. 24 hours later, DNA was isolated using 50 μ L of QuickExtract (EpiCentre).

In vivo nanoparticle formulation

Nanoparticles were formulated using a microfluidic device as previously described.²⁵ Briefly, nucleic acids (DNA barcodes) were diluted in 10 mM citrate buffer (Teknova) while lipid–amine compounds and alkyl tailed PEG (Avanti Lipids) were diluted in ethanol. Citrate and ethanol phases were combined in a microfluidic device by syringes (Hamilton Company) at a flow rate of 600 μ L min^{-1} and 200 μ L min^{-1} , respectively. Nanoparticles were dialyzed in $1 \times$ PBS for 2 hours before sterile filtration.

Animal experiments

All animal experiments were approved by (and performed in accordance with) the Georgia Institute of Technology IACUC committee, and all experiments were compliant with the relevant laws and institutional guidelines. C57BL/6J (#000664) mice were purchased from The Jackson Laboratory and used between 5–8 weeks of age. In all *in vitro* and *in vivo* experiments, we used $N = 3$ –4 group. Mice were injected intravenously *via* the lateral tail vein. The nanoparticle concentration was determined using NanoDrop (Thermo Scientific). Mice were administered at a DNA barcode dose of 0.5 mg kg^{-1} .

Cell isolation & staining

Cells were isolated 24 hours after injection with LNPs. Mice were perfused with 20 mL of $1 \times$ PBS through the right atrium. Tissues were finely cut, and then placed in a digestive enzyme solution with Collagenase Type I (Sigma Aldrich), Collagenase XI (Sigma Aldrich) and hyaluronidase (Sigma Aldrich) at 37 °C at 550 rpm for 45 minutes. The digestive enzyme for heart and spleen included Collagenase IV. Cell suspension was filtered

through 70 μ m mesh and red blood cells were lysed. Cells were stained to identify specific cell populations and sorted using the BD FACS Fusion cell sorter in the Georgia Institute of Technology Cellular Analysis Core. Cell populations were labeled with anti-CD31 (390, BioLegend) and anti-CD45.2 (104, BioLegend), we define lung endothelial cells as $\text{CD31}^+ \text{CD45}^-$.

PCR amplification for illumina sequencing

All samples were amplified and prepared for sequencing using a two-step, nested PCR protocol. More specifically, 2 μ L of primers (10 μ M for base reverse/forward) were added to 5 μ L of Kapa HiFi 2X master mix, and 3 μ L template DNA/water. This first PCR reaction was ran for 20–30 cycles. The second PCR, to add Nextera XT chemistry, indices, and i5/i7 adapter regions was ran for 5–10 cycles and used the product from 'PCR 1' as template. Dual-indexed samples were ran on a 2% agarose gel to ensure that PCR reaction occurred before being pooled and purified using BluePippin (Sage Science).

Deep sequencing

Illumina sequencing was conducted in Georgia Institute of Technology's Molecular Evolution core. Runs were performed on an Illumina NextSeq. Primers were designed based on Nextera XT adapter sequences.

Barcode sequencing normalization

Counts for each particle, per cell type, were normalized to the barcoded mixture applied to serum, cells, or injected into the mouse.

Data analysis & statistics

Sequencing results were processed using a custom R script to extract raw barcode counts for each tissue. These raw counts were then normalized with an R script prior for further analysis. Statistical analysis was done using GraphPad Prism 7; more specifically, one-way ANOVAs were used where appropriate. For all conditions, $n = 3$ unless otherwise stated. Data is plotted as mean $\pm$ standard error mean unless otherwise stated.

Data access

The data, analyses, and scripts used to generate all figures in the paper are available upon requests made to dahlmanlab.org.

Conflicts of interest

J. E. D. and C. D. S. have filed intellectual property related to this publication.

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