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Optimization of the activity and biodegradability of ionizable lipids for mRNA delivery via directed chemical evolution

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Ionizable lipids largely determine the biocompatibility of lipid nanoparticles (LNPs) and the efficacy for mRNA delivery. Rational design and combinatorial synthesis have led to the development of potent and biodegradable ionizable lipids, yet methodologies for the stepwise optimization of ionizable lipid structure are lacking. Here we show that iterative chemical derivatization and combinatorial chemistry, and in particular the amine-aldehyde-alkyne coupling reaction, can be leveraged to iteratively accelerate the structural optimization of propargylamine-based ionizable lipids (named A³-lipids) to improve their delivery activity and biodegradability. Through five cycles of such directed chemical evolution, we identified dozens of biodegradable and asymmetric A³-lipids with delivery activity comparable to or better than a benchmark ionizable lipid. We then derived structure-activity relationships for the headgroup, ester linkage and tail. Compared with standard ionizable lipids, the lead A³-lipid improved the hepatic delivery of an mRNA-based genome editor and the intramuscular delivery of an mRNA vaccine against SARS-CoV-2. Structural criteria for ionizable lipids discovered via directed chemical evolution may accelerate the development of LNPs for mRNA delivery.

Messenger RNA (mRNA)-based therapeutics and vaccines are revolutionizing modern medicine approaches to treat or prevent diseases. The recent approval of three lipid nanoparticle (LNP)-based RNA drugs (Patisiran, mRNA-1273 and BNT162b2) and continuing advances in LNP technologies for mRNA therapeutics/vaccines and clustered regularly interspaced short palindromic repeats (CRISPR) gene editing have sparked great interest in this safe and effective non-viral vector^{1,2}. The conventional LNP formulation comprises four components: ionizable lipids, phospholipids, cholesterol and polyethylene glycol (PEG)-conjugated lipids. An ionizable lipid typically consists of an amino headgroup and two (or more) alkyl tails that are connected by linkers, which plays a pivotal role in protecting and transporting RNA cargo^{3,4}. Under acidic LNP formulation conditions, ionizable lipids are protonated and switched to a positively charged state, allowing for complexation with and encapsulation of anionic RNA molecules. At physiological pH, ionizable lipids remain neutral, thereby circumventing charge-related toxicity and improving the pharmacokinetic profile of LNPs. Following cellular uptake, the acidic environment of the endosome facilitates the protonation of ionizable lipids, leading to endosomal escape and release of mRNA¹.

Notably, ionizable lipids govern not only the potency but also the biocompatibility of LNPs. Therefore, current research focuses on



Fig. 1|**A³-coupling reaction and activity- and degradability-driven directed chemical evolution of A³-lipids. a**, The reaction scheme and mechanism of A³-coupling. An alkynyl–Cu intermediate is formed, which reacts with in situ produced iminium ion originated from aldehyde and amine to form a propargylamine with concomitant regeneration of the Cu⁺ catalyst. **b**, A workflow of activity- and degradability-driven directed chemical evolution of A³-lipids. The process starts with a pilot library of A³-lipids established using readily available starting materials. After screening and analysis, the selected A³-lipid is used

as the starting point for subsequent rounds of rationale-driven, customized, site-directed 'mutagenesis' and selection, which gradually improves the desired activity and biodegradability over multiple iterations. This directed chemical evolution approach enables accelerated discovery of desired ionizable lipids and valuable design criteria. The desired A³-lipids comprise two ionizable nitrogens, an amino-diacid motif, two 2° esters and pseudo-three tails with an asymmetric tail structure.

development of ionizable lipids with improved activity and biodegradability. Ionizable lipids are conventionally synthesized via medicinal chemistry or combinatorial chemistry. The medicinal chemistry approach involves rational design and multistep organic synthesis of ionizable lipids, guided by the putative in vivo mechanism of action and empirical structural criteria⁵. The US Food and Drug Administration (FDA)-approved DLin-MC3-DMA (MC3) is a representative ionizable lipid developed on the basis of this approach^{5,6}. Although this approach ensures a high success rate to generate desirable lipid candidates, it is limited by laborious, low-throughput synthesis, making it difficult to create structurally diverse lipids and systematically investigate structure-activity relationships (SARs). The combinatorial chemistry approach typically involves one-pot synthesis of ionizable lipids based on highly efficient two-component reactions or multicomponent reactions (MCRs)⁷⁻¹¹. It enables rapid, high-throughput synthesis of structurally diverse lipids, yet it suffers from a low hit rate for lipids with both high potency and biodegradability due to limitations regarding readily available starting materials^{7,8}. Combining medicinal chemistry-based rational design of optimal building blocks with combinatorial chemistry-based high-throughput synthesis exploits the advantages of both approaches to generate desired ionizable lipid structures^{12,13}. However, this combined approach is still highly dependent on user's empiricism and trial-and-error practices, motivating the development of a rationale-driven and stepwise method to structurally optimize ionizable lipids with desired properties.

Directed evolution is a powerful technique used in both chemistry and biology to engineer or improve molecules and biological systems with desired properties by mimicking the principles of natural evolution in a controlled environment^{14–16}. This process involves iterative rounds of mutation, screening and selection to optimize the desired traits or functions¹⁵. We hypothesized that the principles of directed evolution could be harnessed to accelerate ionizable lipid development with improved activity and biodegradability.

In this study, we propose a directed chemical evolution approach for the accelerated, rationale-driven, iterative structural optimization of ionizable lipids based on an innovative combinatorial chemistry-A³ (amine-aldehyde-alkyne) coupling (Fig. 1a). First, we generated a pilot library of propargylamine-based ionizable lipids (termed A^{3} -lipids) using commercially available starting materials and then screened these lipids for their mRNA delivery efficacy (Fig. 1b). The top-performing A³-lipid with favourable structures/traits was used as the starting point for the subsequent round of rationale-driven, customized, site-directed 'mutagenesis' and selection, gradually improving potency and biodegradability over multiple iterations. After five rounds of directed chemical evolution, we discovered dozens of biodegradable, asymmetric A³-lipids with potencies reaching or surpassing an industry standard ionizable lipid and identified key structural criteria dictating their in vivo mRNA delivery efficacy. Finally, we demonstrated the enhanced performance of our lead A3-lipid relative to two FDA-approved ionizable lipids, in both mRNA-based gene editing and vaccine applications. We anticipate that our directed chemical evolution methodology and discovered structural criteria can accelerate the development of desirable ionizable lipids for mRNA delivery from potential years to months or even weeks.

Results

Generating ${\rm A}^3$ -lipids via commercially available starting materials

The three-component coupling of an amine, an aldehyde and an alkyne, commonly known as A³-coupling, has been established as a one-pot, convenient and general approach towards propargylamine derivatives¹⁷. This reaction can be performed under ambient, solvent-free conditions with good tolerance of many functional groups (for example,



Fig. 2 | **Combinatorial synthesis and screening of A**³-**lipids in Library 1. a**, Combinatorial synthesis of A³-lipids via A³-coupling of commercially available amines (1–30), formaldehyde (a) and alkynes (A–F). A representative synthesis of 11(aB)₂ through A³-coupling twice is shown. **b**, In vitro mLuc expression in a heat map. Data are presented as mean (n = 2 independent biological replicates, initial

screening). HepG2 cells were treated with mLuc-loaded LNPs at an mRNA dose of 15 ng per well for 24 h. RLU, relative light unit. Untreated cells typically exhibited <100 RLU. **c**, Distribution of A³-lipids with in vitro mLuc expression >2,000 RLU across alkyne structure.

alcohols, carboxylic acids and esters)¹⁸. A³-coupling is atom economical and eco-friendly with water as the only by-product¹⁹. Moreover, depending on the amine and aldehyde used, symmetric dipropargylamines or asymmetric monopropargylamines can be synthesized, which increases the structural diversity of the products. Therefore, A³-coupling is an ideal combinatorial chemistry reaction for ionizable lipid synthesis.

Since A³-coupling has never been adapted for synthesizing ionizable lipids, we first established a pilot library of 180 A³-lipids to evaluate the potential of this reaction using commercially available amines (1–30), formaldehyde (a) and alkynes (A–F) (Fig. 2a). Notably, excess aldehyde and alkyne were used to enable repeated A³-coupling to produce tertiary (3°) amine-based A³-lipids (Supplementary Fig. 1). We noticed that aromatic alkynes (A–C) typically gave moderate yields (~50%), whereas aliphatic alkynes (D–F) typically gave poor yields (<10%). This observation is consistent with previous studies, where aliphatic alkynes were found to be less efficient in forming dipropargylamines compared with aromatic alkynes^{18,20}.

We next proceeded to test the invitro mRNA delivery efficiency of 90 A³-lipids derived from aromatic alkynes due to their practical yields (Fig. 2b). In vitro testing, which has been widely used to screen large libraries of crude ionizable lipids^{7,12}, allows us to preliminarily identify promising lipid candidates, exclude inefficacious ones and understand SARs in a time- and resource-efficient manner. Crude A³-lipids were formulated into A³-LNPs along with other standard lipid excipients and firefly luciferase mRNA (mLuc). HepG2 cells (a human hepatocellular carcinoma cell line) were treated with A3-LNPs at a low mRNA dose (15 ng per well) to avoid potential cytotoxicity (Supplementary Fig. 2). Among the A3-lipids in this library, amine 11-derived symmetric 11(aB)₂ demonstrated the highest transfection, and its analogues (that is, $11(aA)_2$ and $11(aC)_2$) also showed some transfection (>100 RLU, Fig. 2b). Notably, the alkyl substituent on the aromatic alkyne greatly affected mRNA transfection, and the elongation of the alkyl substituent appeared to increase the delivery efficiency (Fig. 2c). Through this pilot study, we quickly validated the feasibility of A³-coupling to produce ionizable lipids and the potential of amine 11-based A³-lipids for mRNA delivery. However, the lead A³-lipid 11(aB)₂ is not optimal for in vivo mRNA delivery applications since it is not biodegradable and contains relatively short tails compared with FDA-approved ones^{1,6}.



Fig. 3 | Optimization of symmetric A³-lipids with biodegradable alkynes in Library 2 and asymmetric A³-lipids with long-chain aldehydes in Library 3. a, Biodegradability-driven directed chemical evolution of A³-lipids starting from 11(aB)₂. Cleavable ester linkers were introduced into 11(aB)₂ and 6 biodegradable symmetric A³-lipids with linear or branched tails were generated. b, In vitro mLuc expression. HepG2 cells were treated with mLuc-loaded LNPs at an mRNA dose of 15 ng per well for 24 h. Data are presented as mean \pm s.d. (n = 3 independent biological replicates). Statistical significance was evaluated using one-way ANOVA with Tukey's correction. c, In vivo mLuc expression. Mice were i.v. injected with mLuc-loaded LNPs at an mRNA dose of 0.1 mg kg⁻¹. Images were taken at 4 h post treatment and whole-body total flux was quantified. Dashed lines indicate the levels of 11(aB)₂ LNP and MC3 LNP, respectively. Data are presented as mean ± s.d. (n = 3 independent biological replicates). Statistical significance was evaluated using one-way ANOVA with Tukey's correction. **d**, Correlation between in vitro and in vivo mLuc expression. Statistical significance was evaluated using two-tailed correlation analysis in GraphPad Prism 8.0. **e**, Asymmetry-driven directed chemical evolution of A³-lipids starting from 11(aL)₂. The optimized ionizable head structure (highlighted in grey) and one alkynyl tail L were maintained, while a long-chain aldehyde was introduced as another tail to generate asymmetric A³-lipid. **f**, In vivo mLuc expression. Mice were i.v. injected with mLuc-loaded LNPs at an mRNA dose of 0.1 mg kg⁻¹. Images were taken at 4 h post treatment and whole-body total flux was quantified. Data are presented as mean ± s.d. (n = 3 independent biological replicates).

Mutating symmetric A³-lipids via biodegradable alkynes

On the basis of the high in vitro transfection efficacy, we chose $11(aB)_2$ as the starting point for iterative directed chemical derivatization to optimize the structure. In this cycle, we considered both efficacy and biodegradability, since biodegradable ionizable lipids are highly preferred for in vivo mRNA delivery¹. Therefore, we introduced cleavable ester linkers into the tail region of A³-lipids by customizing six aromatic alkynes (G–L) via a one-step esterification reaction (Supplementary Method 1 and Fig. 3a). G, I and K were aromatic alkynes with elongated

linear alkyl substituents, while H, J and L were their branched counterparts. Branched alkynyl tails were included since branching allows the ionizable lipid to adopt a more cone-shaped structure that is beneficial for endosomal escape and mRNA delivery^{21–23}.

The six customized biodegradable A³-lipids (11(aG)₂–11(aL)₂, Supplementary Fig. 3) were purified (Supplementary Fig. 4) and tested for in vitro and in vivo mLuc delivery. With increasing tail length and branching, A³-lipids generally showed increased in vitro transfection efficacy (Fig. 3b and Supplementary Fig. 5), but their in vivo activities

were disparate (Fig. 3c). Linear $11(aG)_2$ and $11(aK)_2$ showed limited in vivo transfection efficacy that was similar to that of $11(aB)_2$, presumably due to their low and high lipophilicity, respectively. Branched A³-lipids generally outperformed their linear counterparts both in vitro and in vivo, apart from $11(aJ)_2$ which showed slightly lower in vivo activity than $11(aI)_2$. $11(aL)_2$ with a symmetric structure and two biodegradable branched tails was identified as the lead A³-lipid in this library with the highest in vivo mRNA delivery efficiency. After analysing the relationship between in vitro and in vivo results, we found a poor correlation (Fig. 3d), which has also been observed by others²⁴. Therefore, only the in vivo mRNA delivery efficiency of A³-lipids was examined in subsequent directed chemical evolution cycles.

Mutating asymmetric A³-lipids via long-chain aldehydes

While the lead $11(aL)_2$ achieved a whole-body total flux of -4.2×10^8 p s⁻¹, it did not reach the transfection level of the industry standard lipid MC3, which has been predetermined to be -1.0×10^9 p s⁻¹ (Fig. 3c). Previous studies have suggested that asymmetric ionizable lipids with two different alkyl tails are prone to show better in vivo delivery efficacy than their symmetric analogues^{25,26}. It is hypothesized that asymmetric tails lower the packing density, mitigate the crystallization tendency and increase the fluidity of the lipid bilayer^{25,27}. Therefore, for the next round of directed chemical evolution, we maintained the optimized ionizable head structure and alkynyl tail L (tail one) while mutating the aldehyde (tail two) to generate asymmetric A³-lipids.

Notably, owing to the flexibility of A³-coupling, asymmetric A³-lipids can be easily synthesized from an amine, a long-chain aldehyde and a long-chain alkyne via A³-coupling once. To maintain the optimized ionizable head structure, we used a secondary (2°) amine 31 (a methyl derivative of amine 11) to ensure that only 3° amines exist in the A³-lipid structure (Fig. 3e). Three commercially available long-chain aldehydes (b–d) were used to establish a pilot library of asymmetric A³-lipids to verify our hypothesis (Supplementary Fig. 6). Excitingly, all three A³-lipids (31bL–31dL) slightly surpassed the in vivo performance of MC3, with 31cL identified as the lead lipid (Fig. 3f). These data demonstrate the merit of an asymmetric A³-lipid structure. Moreover, asymmetric A³-lipids appear to have good tolerability of aldehydes as both aliphatic and aromatic ones can afford potent A³-lipids.

We also synthesized an asymmetric, 2° amine-containing A³-lipid 11bL via A³-coupling once of amine 11, aldehyde b and alkyne L (Supplementary Fig. 6). However, 11bL neither outperformed MC3 lipid nor its 3° amine-containing analogue 31bL (Fig. 3f). Due to the scope of this study, we focused subsequent rounds of directed chemical evolution on the asymmetric, 3° amine-based A³-lipids.

Mutating asymmetric A³-lipids via biodegradable aldehydes and alkynes

Inspired by our findings on asymmetric A³-lipid performance, we further optimized amine 31-based asymmetric A³-lipids by introducing biodegradability into the aldehyde structure and diversifying the tail structures. In this cycle of directed chemical derivatization, five biodegradable aromatic aldehydes (e–i) with linear or branched structures were synthesized via a one-step esterification reaction (Supplementary Method 1 and Fig. 4a). Here we chose aromatic aldehydes for two reasons: first, they can be easily prepared; second, the benzylic structure

Fig. 4 | **Optimization of biodegradable tails and headgroups for asymmetric A³-lipids in Libraries 4 and 5. a**, Optimization of biodegradable tails in asymmetric A³-lipids in Library 4. A total of 35 asymmetric A³-lipids were combinatorially synthesized via A³-coupling of amine 31, 5 biodegradable aldehydes (e–i) and 7 biodegradable alkynes (L–R). A representative synthesis of 31hP through A³-coupling is shown. Mice were i.v. injected with mLuc-loaded LNPs at an mRNA dose of 0.1 mg kg⁻¹. Images were taken at 4 h post treatment and whole-body total flux was quantified. Data are presented as mean (*n* = 3 independent biological replicates). **b**, Screening of ionizable headgroup is indicated to enhance the stability of LNP through intermolecular $\pi - \pi$ stacking²⁸. Similarly, we synthesized six additional biodegradable alkynes (M–R) with linear or branched structures. Notably, we diversified these aldehydes and alkynes using different lengths of branch chain (for example, h vs i) and ester orientation (for example, M vs Q) to study their SARs. Through combinatorial synthesis, 35 asymmetric A³-lipids were generated in this library (Fig. 4a and Supplementary Fig. 7). In contrast to Library 1, here we found that aliphatic alkynes (M–R) gave moderate yields (-50%) similar to that of the aromatic alkyne L, likely because only a single A³-coupling reaction was required to afford these monopropargylamine products.

After screening the in vivo mLuc delivery activity of Library 4, we identified eight asymmetric A³-lipids with transfection efficacy greater than that of MC3 lipid (Fig. 4a and Supplementary Fig. 8). Specifically. four asymmetric A³-lipids (31iN, 31iO, 31gP and 31 hP) facilitated more than 5-fold greater luciferase expression relative to MC3, with 31hP identified as the top-performer (8-fold higher). Of note, all these four A³-lipids comprise an amino-diacid motif, two 2° esters and two major tails with one long branch tail (pseudo-three tails). Deviating from these structural criteria generally led to reduced in vivo activity (Fig. 4a). The potency of our lead A³-lipids is supported by previous studies that have shown that (1) 2° esters show slower degradation than primary ones, prolonging the availability of the mRNA-LNP complex^{22,26}; (2) branched tail structures allow the ionizable lipid to adopt a more cone-shaped structure for enhanced endosomal disruption^{23,29}; (3) negatively charged carboxylates attached to the ionizable headgroup can neutralize the positive charge, facilitating accelerated dissociation of the mRNA-LNP complex and release of mRNA³⁰.

Mutating the headgroup of asymmetric A³-lipids

With the optimal linker and tail structure identified, we revisited the ionizable headgroup in our final cycle of directed chemical evolution. We mutated the headgroup while maintaining the optimal tail region as 'hP', and screened 26 additional 2° amines with only one active site (-NH-) for the A³-coupling reaction (Fig. 4b and Supplementary Fig. 9). These structurally diverse amines contain different numbers (0–2) of ionizable nitrogens. To the best of our knowledge, most of these amines have not been previously tested.

In this library, we discovered 11 more asymmetric A³-lipids that reached the transfection efficacy of MC3 lipid (Fig. 4b). However, none of these A³-lipids surpassed the potency of 31hP including the lead 32hP, suggesting the superiority of amine 31 for mRNA delivery. Interestingly, two ionizable nitrogens occurred in all potent A³-lipids (31–42 hP), but this feature alone was not adequate to afford potent ones (for example, 43hP, 45–49hP). A³-lipids with one ionizable nitrogen (51hP, 54–57hP) or three ionizable nitrogens (44hP, 50hP and 52hP) were inferior for in vivo mRNA delivery, which may be a detrimental consequence of dramatically changed polarity.

After five cycles of activity- and biodegradability-driven directed chemical evolution of A³-lipids, we identified 31hP as the top-performing ionizable lipid (characterization data in Supplementary Figs. 4, 10 and 11). Notably, throughout this process, we found that 31hP LNP and other potent A³-LNPs predominantly transfected the liver upon intravenous (i.v.) administration, which is consistent with MC3 LNP and the majority of LNPs reported in the literature (Supplementary

in asymmetric A³-lipids in Library 5. A total of 26 asymmetric A³-lipids were combinatorially synthesized via A³-coupling of secondary amine (32–57), aldehyde h and alkyne P. Mice were i.v. injected with mLuc-loaded LNPs at an mRNA dose of 0.1 mg kg⁻¹. Images were taken at 4 h post treatment and whole-body total flux was quantified. Data are presented as mean ± s.d. (n = 3independent biological replicates). **c**, Structure (left) and in vivo mRNA delivery activity (right) of lead A³-lipid in each library. Data are presented as mean ± s.d. (n = 3 independent biological replicates). Statistical significance was evaluated using one-way ANOVA with Tukey's correction.



Library	Design rationale	Favourable structure/trait	Lead A ³ -lipid	No. of degradable linkers	Activity (ps⁻¹)
1	Commercial availability and diversity of building blocks	Amine 11; longer alkyl substituent	11(aB) ₂	0	(1.5±0.2)×10 ⁵
2	Length, branching and biodegradability of tail	Alkyne L; branched tail	11(aL) ₂	2	(4.2±0.7)×10 ⁸
3	3° amine; asymmetry and commercial availability of tail	Amine 31; asymmetric tails	31cL	1	(1.9±0.4)×10 ⁹
4	Biodegradability and branching of tail; ester orientation	Tail region 'hP'; an amino-diacid motif; two 2° esters; pseudo-three tails	31hP	2	(8.0±2.4)×10 ⁹
5	Diversity of headgroup; number of ionizable nitrogens	Two ionizable nitrogens	32hP	2	(5.1±1.4)×10 ⁹

Data are presented as mean±s.d. (n=3 independent biological replicates).

Fig. 12). Moreover, we confirmed that 31hP could be rapidly degraded in the presence of esterase owing to two biocleavable ester bonds (Supplementary Fig. 13), which exhibited improved biodegradability compared with MC3 and comparable biodegradability relative to SM-102 (an asymmetric ionizable lipid with similar ester orientation and pseudo-three tails to our 31h that is used in Moderna's mRNA-1273 vaccine). It is worth mentioning that, during this process, we rationally designed the following library on the basis of the lead A³-lipid and favourable structures/traits identified in the last library and introduced proper 'mutagenesis', so we could direct the chemical evolution of A³-lipids towards this desired outcome (Fig. 4c and Table 1).

Characterization of A³-LNPs

We next characterized the physicochemical properties of the top-performing 31hPLNP formulated by microfluidic mixing (Fig. 5a). The hydrodynamic size of 31hP LNP was ~80 nm with a polydispersity index (PDI) of 0.093 and a neutral surface charge ($\zeta = -0.27$ mV). The mRNA encapsulation efficiency (EE) was determined to be ~93%. The apparent p K_a (acid dissociation constant) of LNP was determined to be 6.25 (Supplementary Fig. 14). Owing to its ionization property, 31hP LNP showed good haemocompatibility at pH 7.4 and increased haemolysis at pH 6.0 (Supplementary Fig. 15). Cryogenic electron microscopy (cryo-EM) imaging results showed that 31hP LNP had a dense spherical structure with a lamellar shell and an amorphous core (Fig. 5b). To investigate the key pathways governing the cellular uptake of 31hP LNP. we performed an internalization inhibition study in vitro (Fig. 5c). The transfection efficacy was significantly reduced in the presence of amiloride or methyl- β -cyclodextrin (M β -CD), suggesting that the cellular uptake of 31hP LNP is mainly facilitated through macropinocytosis and lipid raft-mediated endocytosis.

We further evaluated the stability of 31hP LNP (Supplementary Fig. 16a–c). At 1 week post storage at 4 °C, the hydrodynamic size and PDI of 31hP LNP increased minimally, suggesting its good colloidal stability. Moreover, the in vivo transfection potency of 31hP only moderately decreased (Supplementary Fig. 16d,e). In comparison, both MC3 LNP and SM-102 LNP showed increased size and PDI with a substantial decrease in in vivo transfection potency. It is hypothesized that the benzylic linker contributes to the assembly and stability of 31hP LNP through intermolecular $\pi - \pi$ stacking (Supplementary Fig. 17), which have been utilized in the design of a stable one-component nanoparticle mRNA delivery system²⁸.

Delivering mRNA-based gene editors and vaccines using $\ensuremath{\mathsf{A}}^3\text{-}\ensuremath{\mathsf{LNPs}}$

Following characterization, we aimed to demonstrate the utility of our A³-lipids by delivering therapeutic mRNAs. The 31hP LNP was first examined for the hepatic delivery of mRNA-based CRISPR gene editors, which are much larger than mLuc (~2,000 nt) and are challenging to deliver in vivo³¹. Four other lead A³-LNPs (that is, 11(aB)₂LNP, 11(aL)₂LNP,

31cL LNP and 32hP LNP) selected from each library were also tested to verify our directed chemical evolution approach, and liver-tropic MC3 LNP was selected as the industry standard control LNP (Supplementary Table 1). In a proof-of-principle study, we formulated LNPs co-encapsulating Cas9 mRNA (~4,500 nt) and a single guide RNA (sgRNA) (~100 nt) specific for the transthyretin (TTR) gene, which is implicated in hereditary amyloidosis³². A single injection of 31hP LNP co-delivering Cas9 mRNA and TTR sgRNA at a total RNA dose of 1 mg kg⁻¹ achieved ~18% on-target editing at the TTR locus in the liver and ~30% serum TTR reduction (Fig. 5d-f), which were significantly higher than those of MC3 LNP and other A³-LNPs. Importantly, the TTR gene editing efficiency of A³-LNPs correlated well with in vivo mLuc expression (Fig. 5g), proving the rationale of our directed chemical evolution approach based on mLuc delivery to improve the activity of the ionizable lipid. We further examined some inferior A3-LNPs (that is, 11(aK)2 LNP, 11bL LNP and 31hR LNP) that were excluded during our directed chemical evolution as well as another industry LNP (that is, LPO1LNP) containing a biodegradable, asymmetric ionizable lipid LPO1 (Supplementary Table 1)³². We found that none of these LNPs outperformed 31hP LNP in terms of TTR gene editing and serum TTR reduction (Supplementary Fig. 18), which further demonstrated the superiority of our approach and 31hP.

Next, we investigated the hepatotoxicity of A^3 -LNPs following gene editing. Unlike $11(aB)_2$ LNP and 31cL LNP, A^3 -LNPs formulated with A^3 -lipids with two biodegradable tails (that is, $11(aL)_2$ LNP, 31hP LNP and 32hP LNP) were well tolerated in mice, with no abnormal increases in alanine transaminase (ALT) and aspartate aminotransferase (AST) at 24 h post treatment (Supplementary Fig. 19), demonstrating the rationale of our approach to improve ionizable lipid safety by introducing more biodegradable linkers. In particular, we examined the hepatotoxicity of the degradation metabolite of 31hP (that is, 31hP-M, Supplementary Method 2 and Supplementary Fig. 19) as well as the immunotoxicity of 31hP LNP (Supplementary Fig. 20). With no major toxicity observed, we confirmed a good safety profile of 31hP LNP.

Finally, we evaluated 31hP LNP for mRNA vaccine applications. Recently, the FDA approved the Moderna SARS-CoV-2 mRNA–LNP vaccine that uses the SM-102 ionizable lipid. Therefore, we compared the immunogenicity of SARS-CoV-2 Spike mRNA-loaded 31hP LNP and SM-102 LNP after intramuscular (i.m.) vaccination (Fig. 5h). In a standard prime–boost rodent vaccine model, 31hP LNP elicited a significantly higher anti-Spike antibody titre than the SM-102 LNP vaccine (Fig. 5i). Using a lentivirus-based SARS-CoV-2 pseudovirus neutralization assay, we further confirmed that 31hP LNP triggered a significantly higher neutralization antibody titre than SM-102 LNP (Fig. 5j). Notably, $11(aL)_2$ LNP, 31cL LNP and 32hP LNP triggered higher antibody responses than SM-102 LNP as well. Interestingly, these A³-LNPs and 31hP LNP enabled comparable protein expression to SM-102 LNP in the muscle (Fig. 5k and Supplementary Fig. 21), suggesting that other factors (for example, adjuvant effects) might contribute to the



significantly higher immunogenicity of our A³-LNPs^{10,33,34}. Moreover, these A³-LNPs mediated significantly less off-target expression in the liver relative to SM-102 LNP (Fig. 51), which can potentially mitigate adverse effects (for example, liver injury) associated with current mRNA–LNP vaccines³⁵.

Taken together, these results demonstrate the utility of our activity- and biodegradability-driven directed chemical evolution approach to optimize ionizable lipids towards a desired outcome. Moreover, these results strongly support that 31hP is a superior ionizable lipid relative to industry standard ionizable lipids and holds great promise in the systemic delivery of mRNA therapeutics and intramuscular delivery of mRNA vaccines.

Discussion

Although extensive efforts have been put into the development of ionizable lipids through rational design and/or combinatorial synthesis, there is a lack of methods for stepwise, rational optimization of ionizable lipid structure. In the majority of studies in the literature, researchers typically created a single library of ionizable lipids and investigated SARs. Ionizable lipids generated through this strategy are usually associated Fig. 5 | Characterization of A³-LNP and its application in delivering mRNAbased gene editors and vaccines. a, Physicochemical parameters of 31hP LNP formulated by microfluidic mixing. Data are presented as mean \pm s.d. (n = 3independent biological replicates). b, A representative cryo-EM image of 31hP LNP. Scale bar, 50 nm. c, In vitro transfection of 31hP LNP in the presence of various endocytic inhibitors. Amiloride, an inhibitor of macropinocytosis; chlorpromazine, an inhibitor of clathrin-mediated endocytosis; genistein, an inhibitor of caveolae-mediated endocytosis; Mβ-CD, an inhibitor of lipid raftmediated endocytosis. Data are presented as mean \pm s.d. (n = 3 independent biological replicates). Statistical significance was evaluated using one-way ANOVA with Tukey's correction. d, A scheme of LNP-enabled co-delivery of Cas9 and TTR sgRNA. Mice were i.v. injected with LNPs encapsulating Cas9 mRNA/ TTR sgRNA (4:1, w/w) at a total RNA dose of 1 mg kg⁻¹. On day 7, DNA was extracted from the liver to determine on-target indel frequency using NGS, and serum was collected to determine TTR concentration using ELISA. e, Indels at TTR locus. Data are presented as mean \pm s.d. (*n* = 3 independent biological replicates). Statistical significance was evaluated using one-way ANOVA with Tukey's correction. **f**, Serum TTR. Data are presented as mean \pm s.d. (n = 3 independent

with suboptimal structures and properties, and further optimization and iteration is typically conducted and reported years later in subsequent work. For example, Cullis and colleagues iterated on their first reported ionizable lipid DODAP to DLin-KC2-DMA to MC3 and to L319 with increased potency and biodegradability in separate studies over the course of 10 years^{5,6,30,36}. Similarly, Moderna developed lipid 5 to lipid H (SM-102) and then to their newest lead candidate lipid 29 over the course of several years^{26,37,38}.

Directed evolution is a powerful, high-throughput engineering approach that has been successfully utilized to generate adenoassociated viruses with enhanced transduction efficiency and tissue tropism^{39,40}. Inspired by this, we hypothesized that directed chemical evolution of ionizable lipids could be achieved through multiple rounds of rationale-driven, customized, site-directed mutation and selection under the selective pressure of transfection efficacy and biodegradability. With the help of this methodology, we can guide ionizable lipid evolution towards a desired outcome with a dramatically truncated timeline from potential years to months or even weeks, in contrast to the conventional paradigm for ionizable lipids iteration in a prolonged timeline and a low-efficiency manner.

In our study, this process began by creating a pilot library of A³-lipids using diverse, commercially available building blocks. We conducted this pilot study to evaluate the feasibility, gather preliminary data and identify potential issues. In Library 2, we introduced rationale-driven, customized, site-directed 'mutagenesis'-biodegradable ester linkers and branches-into the backbone of the selected 11(aB)₂ lipid, leading to the identification of a biodegradable symmetric lipid 11(aL)₂. In Library 3, we introduced asymmetry into the selected 11(aL)₂ lipid and created a pilot library of asymmetric A³-lipids using commercially available long-chain aldehydes. After the successful verification of our hypothesis about asymmetry, we further expanded the diversity of asymmetric A³-lipids in Library 4 by introducing rationale-driven, customized 'mutagenesis'-biodegradable ester linkers, branches and aliphatic alkynes. In Library 5, we kept the optimal tail region constant and mutated the headgroup using various amines to further gain insights into this ionizable motif. Importantly, this directed chemical evolution of A³-lipids can be continued on the basis of varying research interests. For example, to investigate the positional effect of the ester linkage^{26,30}, customized ester 'mutagenesis' can be introduced into different positions of the long-chain aldehydes and alkynes. In addition, ionizable lipids containing 2° amines have demonstrated superior in vivo activity in some studies^{7,8}, therefore, we can also choose 11bL as the starting point for subsequent rounds of directed chemical evolution to optimize A³-lipids with this trait.

Here, A³-coupling was adapted to synthesize symmetric and asymmetric ionizable lipids. We found this synthetic method to be a particularly useful MCR to generate asymmetric ionizable lipids with

biological replicates). Statistical significance was evaluated using one-way ANOVA with Tukey's correction. g, Correlation between in vivo mLuc expression and TTR gene editing efficiency. Statistical significance was evaluated using twotailed correlation analysis in GraphPad Prism 8.0. h, A scheme of LNP-enabled delivery of SARS-CoV-2 Spike mRNA vaccine. Mice were vaccinated i.m. at a dose of 2 µg mRNA per mouse twice using a prime-boost strategy at a 3-week interval. Serum was collected at the indicated time points to determine anti-Spike IgG titres and SARS-CoV-2 pseudovirus neutralization antibody titres. i, Anti-Spike IgG titres. Data are presented as mean \pm s.d. (n = 5 independent biological replicates). Statistical significance was evaluated using one-way ANOVA with Tukey's correction. j, SARS-CoV-2 pseudovirus NT₅₀. Data are presented as mean \pm s.d. (*n* = 5 independent biological replicates). Statistical significance was evaluated using one-way ANOVA with Tukey's correction. k,l, In vivo mLuc expression following i.m. administration. Mice were i.m. injected with mLucloaded LNPs at a dose of 2 µg mRNA per mouse. Images were taken at 4 h post treatment and total flux at injection site (k) or liver region (l) was quantified. Data are presented as mean \pm s.d. (n = 3 independent biological replicates). Statistical significance was evaluated using one-way ANOVA with Tukey's correction.

two distinct tails, which typically require laborious synthesis^{26,41,42}. Moreover, the mild synthetic conditions, easily accessible building blocks, good tolerance of functional groups and minimal by-products make A³-coupling an ideal combinatorial chemistry for ionizable lipid synthesis. In addition, due to the nature of A³-coupling, all synthesized A³-lipids contain an alkyne structure, which has been shown to increase the fusogenicity and endosomal escape of LNPs^{12,43}. In this reaction, we noticed that, compared with aromatic alkynes, aliphatic alkynes are less efficient in synthesizing dipropargylamines but equally efficient in synthesizing monopropargylamines. While the typical yield in our current synthetic scheme is modest in most cases, increased yields are expected when more efficient catalysts are used^{44,45}.

Our results suggest that asymmetric A³-lipids tend to show higher in vivo transfection efficacy than symmetric ones (Library 2 vs Libraries 3 and 4), which is supported by others 25,26,46 . Interestingly, several industry ionizable lipids (including SM-102 and LPO1) recently chosen for clinical development are asymmetric, in contrast to the symmetric tail structure of the early developed MC3 (ref. 1). We noticed that our lead asymmetric A³-lipids share some structural features, including an amino-diacid motif, two ionizable nitrogens, two 2° esters and pseudo-three tails. These A³-lipids exhibit structural similarity to industry ionizable lipids rather than many literature ones, where a polyamine core is typically attached to multiple alkyl tails⁷⁻⁹. Our lead 31hP LNP exhibited higher stability and durability compared with MC3 LNP and SM-102 LNP at refrigerator temperature, suggesting its advantages in storage and transport. Moreover, 31hP LNP achieved more efficient hepatic mRNA delivery with a much higher gene editing efficiency than MC3 LNP and LP01 LNP when CRISPR gene editors were delivered. With regard to intramuscular mRNA vaccine delivery, 31hP LNP triggered higher antibody responses than SM-102 LNP following a prime-boost vaccination strategy. Further mechanistic investigation is warranted to understand the strong immunogenicity of 31hPLNP vaccine. Nevertheless, these results suggest that ionizable lipids generated through a directed chemical evolution strategy can rapidly reach, and even surpass, the potency of industry ionizable lipids that were developed over years.

In summary, we established an activity- and biodegradability-driven directed chemical evolution approach for the accelerated structural optimization of A³-lipids through iterative, rationale-driven mutation and selection. An A³-coupling reaction was applied and developed to synthesize A³-lipids with desired properties following five rounds of iteration. Dozens of potent, biodegradable, asymmetric A³-lipids were identified, and their key structural criteria are reported. The lead A³-lipid showed superior hepatic delivery of gene editors and intramuscular delivery of mRNA vaccines compared with several industry standard ionizable lipids, highlighting the potential of this ionizable lipid for therapeutic and vaccine applications. We foresee that our directed-chemical-evolution methodology and resulting structural criteria can accelerate the development of desirable ionizable lipids for a broad range of mRNA delivery applications.

Methods Materials

Amines, aldehydes, alkynes, alcohols, carboxylic acids, *N,N*⁻dicyclohexylcarbodiimide (DCC), 4-dimethylaminopyridine (DMAP) and copper(I) chloride were purchased from Sigma Aldrich, Tokyo Chemical Industry, Ambeed and AstaTech. 1,2-dioleoyl-*sn*-glycero-3-phosphoethanolamine (DOPE), 1,2-distearoyl-*sn*-glycero-3-phosphocholine (DSPC),1,2-dimyristoyl-rac-glycero-3-m ethoxypolyethylene glycol-2000 (DMG-PEG 2000) and cholesterol were obtained from Avanti Polar Lipids. DLin-MC3-DMA and SM-102 were purchased from MedChem Express. LPO1 was purchased from Cayman Chemical. Porcine liver esterase was obtained from Sigma Aldrich. Nucleoside-modified Cas9 mRNA (5moU) was bought from TriLink. Highly modified sgRNA target mouse TTR (guide No. G211) was chemically synthesized by a commercial supplier (AxoLabs) on the basis of a previous publication⁴⁰.

mRNA synthesis

Codon-optimized firefly luciferase sequence or SARS-CoV-2 Spike sequence was cloned into a proprietary mRNA production plasmid (optimized 3' and 5' UTR with a 101 polyA tail), in vitro transcribed in the presence of 1-methyl pseudouridine modified nucleoside, co-transcriptionally capped using the CleanCap technology (TriLink) and cellulose purified to remove double-stranded RNAs. Purified mRNA was ethanol precipitated, washed, resuspended in nuclease-free water and subjected to quality control. All mRNAs were stored at -20 °C until use.

Synthesis of biodegradable aldehydes and alkynes

Details on the synthesis and characterization of biodegradable aldehydes and alkynes are provided in Supplementary Information.

Combinatorial synthesis of A³-lipids in Libraries 1 and 2

These A³-lipids were synthesized via solvent-free, copper(I) chloride catalysed A³-coupling of amine, formaldehyde and alkyne (Method A)¹⁸. Excess formaldehyde and alkyne (1.25 eq. of -NH-) were used to ensure repeated A³-coupling reactions. Taking amine 11 as an example, amine 11 (0.1 mmol, 1 eq.), formaldehyde (0.25 mmol, 37% in water, 2.5 eq.), alkyne (0.25 mmol, 2.5 eq.) and copper(I) chloride (0.01 mmol, 0.1 eq.) were combined in a glass vial and stirred at 50 °C for 48 h. Excess triethylamine was added to the reaction if the amine was in the salt form. The yield was typically ~50% for aromatic alkynes and <10% for aliphatic alkynes. The crude A³-lipids in Library 1 were dissolved in ethanol and directly used for in vitro screening. The crude A³-lipids in Library 2 as well as the lead A³-lipid in Library 1 were purified using a CombiFlash NextGen 300+ chromatography system (Teledyne Isco) with gradient elution from 100% dichloromethane (DCM) to 60% DCM/MeOH/ NH₄OH (75:22:3, aqueous), and target products were confirmed by MS and ¹H NMR. The yield was typically ~50%.

Combinatorial synthesis of A³-lipids in Libraries 3–5

These A³-lipids were synthesized via A³-coupling of amine, long-chain aldehyde and long-chain alkyne (Method B). Excess amine (1.25 eq. of aldehyde/alkyne) was used. Taking amine 31 as an example, amine 31 (0.125 mmol, 1.25 eq.), long-chain aldehyde (0.1 mmol, 1 eq.), long-chain alkyne (0.1 mmol, 1 eq.) and copper(I) chloride (0.01 mmol, 0.1 eq.) were combined in a glass vial and stirred at 50 °C for 48 h. The crude products in Libraries 3–5 were purified using a CombiFlash NextGen 300+ chromatography system with gradient elution from 100% DCM to 80% DCM/MeOH/NH₄OH (75:22:3, aqueous), and target products were confirmed by MS and ¹H NMR. The yield was typically -50%.

LNP formulation

For in vitro and in vivo screening of Libraries 1–5, A^3 -LNPs were prepared by pipette mixing of the ethanolic phase containing A^3 -lipid, DOPE, cholesterol and DMG-PEG, with the aqueous phase (10 mM citrate buffer, pH 3) containing mLuc at a volume ratio of 1:3. The weight ratio of A^3 -lipid:DOPE:cholesterol:DMG-PEG:mRNA was fixed at 16:10:10:3:1.6. The hydrodynamic size of A^3 -LNP formulated by pipette mixing was typically 100–200 nm and the mRNA encapsulation efficiency was typically 60–80%.

For therapeutic mRNA delivery, LNPs were formulated by microfluidic mixing. The ethanolic phase containing lipids (A³-lipid:D OPE:Chol:DMG-PEG = 40:10:48.8:1.5 (ref. 47)) was mixed with the aqueous phase containing mRNA at a flow rate ratio of 1:3 and at an A³-lipid:mRNA weight ratio of 10:1 in a microfluidic chip device⁴⁸. The standard MC3 LNP (or SM-102 LNP) was formulated with MC3 (or SM-102), DSPC, cholesterol and DMG-PEG at a molar ratio of 50:10:38.5:1.5 using microfluidic mixing at an ionizable lipid:mRNA weight ratio of 10:1. The standard LP01LNP was formulated according to a previous study³². LNPs were dialysed against 1× PBS in a 20 kDa MWCO cassette for 2 h, filtered through a 0.22 µM filter and stored at 4 °C.

Characterization

¹H NMR was recorded using a Bruker 400 MHz NMR spectrometer. MS was performed on a Waters Acquity LC–MS system equipped with UV-Vis and MS detectors. The hydrodynamic size, PDI and zeta potential of LNPs were measured using a Malvern Zetasizer Nano ZS90 instrument. The morphology of LNPs was characterized using a cryo-electron microscope (Titan Krios, Thermo Fisher) equipped with a K3 Bioquantum. The mRNA encapsulation efficiency and the pK_a of LNP were determined using a modified Quant-iT RiboGreen RNA assay (Invitrogen) and a 6-(*p*-toluidinyl)naphthalene-2-sulfonic acid (TNS) assay⁴⁹, respectively.

Molecular modelling

Molecular models of 31hP were drawn using DS ViewerPro (v.5.0) software. Material Studio Modelling (v.3.1) software from Accelrys was used to perform the energy minimizations of the built models on the supramolecular structures. BIOVIA Discovery Studio Visualizer (v.2019) was used for display style and colouring.

Cell culture and animal studies

The human hepatocellular carcinoma HepG2 cell line was purchased from American Type Culture Collection (ATCC) and maintained in Dulbecco's modified Eagle medium (DMEM) supplemented with 10% fetal bovine serum (FBS), 100 U ml⁻¹ penicillin and 100 μ g ml⁻¹ streptomycin. Cells were cultured at 37 °C in a humidified incubator with 5% CO₂ and routinely tested for mycoplasma contamination.

All animal protocols were approved by the Institutional Animal Care and Use Committee of the University of Pennsylvania (806540), and animal procedures were performed in accordance with the Guide-lines for the Care and Use of Laboratory Animals at the University of Pennsylvania. C57BL/6 female mice (6–8 weeks, 18–20 g) were purchased from Jackson Laboratory and housed in a specific-pathogen-free animal facility at ambient temperature (22 ± 2 °C), air humidity (40%–70%) and 12-h dark/12-h light cycle.

In vitro mLuc delivery by A³-LNPs

HepG2 cells were seeded in 96-well plates at a density of 5,000 per well overnight and mLuc-loaded A³-LNPs (15 ng mRNA per well) were used to treat cells for 24 h. Luciferase expression was evaluated using the Luciferase Reporter 1000 Assay system (Promega, E4550) and cell viability was measured using a CellTiter-Glo Luminescent Cell Viability Assay system (Promega, G7572) according to manufacturer protocols.

In vivo mLuc delivery by A³-LNPs

Mice were i.v. injected with mLuc-loaded A³-LNPs at an mRNA dose of 0.1 mg kg–1. For i.m. delivery, mLuc-loaded A³-LNPs (2 μ g mRNA in 50 μ l PBS) were injected into the gastrocnemius muscle. After 4 h, mice were intraperitoneally (i.p.) injected with D-luciferin potassium salt (150 mg kg⁻¹), and bioluminescence imaging was performed using an in vivo imaging system (PerkinElmer).

Haemolysis assay

Mouse red blood cells (RBCs) were isolated and washed three times with 1× PBS by centrifugation at 700 g for 5 min. Next, RBCs were diluted to a 4% v/v RBC solution either in neutral (pH7.4) or acidic (pH 6.0) PBS, and incubated with LNPs at a final mRNA concentration of 3 μ g ml⁻¹ at 37 °C for 1 h. Finally, the RBC solution was centrifuged at 700 g for 5 min and 100 μ l supernatant was transferred into a 96-well plate. The absorption at 540 nm was determined with 0.1% Triton-X and 1× PBS, respectively.

Cellular internalization inhibition

HepG2 cells were seeded in a 96-well plate at a density of 5,000 per well overnight. Cells were pretreated with 5 mM amiloride, 20 μ M chlor-promazine, 0.2 mM genistein or 5 mMM β -CD for 30 min. A control group was pretreated with dimethylsulfoxide (DMSO). Then, cells were treated with mLuc-loaded LNPs (15 ng per well) for 24 h. Luciferase expression was determined as described above and normalized to the control.

Biodegradability analysis

Ionizable lipid at 0.5 mg ml⁻¹ in 1× PBS was incubated with or without porcine liver esterase (100 U ml⁻¹) at 37 °C for 12 h. The incubation solution was mixed with a 10-fold volume of acetonitrile to terminate the reaction, and the mixture was centrifuged at 10,000 r.p.m. for 5 min. The remaining ionizable lipid in the supernatant was analysed using LC–MS.

Systemic delivery of CRISPR gene editor

Mice were i.v. injected with Cas9 mRNA/TTR sgRNA (4:1, w/w)-loaded LNPs at a total RNA dose of 1 mg kg⁻¹. Serum was collected on day 7 and analysed by enzyme-linked immunosorbent assay (ELISA) (Aviva Systems Biology, OKIA00111). Mice were euthanized and livers were collected to determine the on-target indel frequency by next-generation sequencing (NGS). For TTR on-target DNA sequencing, DNA was extracted from the liver using the Qiagen Puregene Tissue kit (158063) and quantified using a Nanodrop 2000 spectrophotometer. PCR amplification of the TTR target site was carried out using Q5 High-Fidelity DNA polymerase (New England Biolabs, M0491) and the following primer sequences: mTTR-exon2-F, 5'-CGGTTTACTCTGACCCATTTC-3' and mTTR-exon2-R, 5'-GGCTTTCTACAAGCTTACC-3'. Deep sequencing of the TTR amplicons and determination of the on-target indel frequency were performed essentially as described except that 150 bp paired-end reads were produced⁵⁰.

Intramuscular delivery of SARS-CoV-2 mRNA vaccine

Mice were i.m. injected with SARS-CoV-2 Spike mRNA-loaded LNPs ($2 \mu g$ mRNA in 50 μ l PBS) twice using a prime-boost strategy at a 3-week interval. Serum was acquired at 5 weeks post prime vaccination. Anti-Spike IgG titres and pseudovirus neutralization antibody titres against D614G-mutated SARS-CoV-2 ancestor strain were determined.

To determine anti-Spike IgG titres, 96-well clear polystyrene high bind Stripwell microplates (Corning) were coated overnight with 1 µg ml⁻¹ purified SARS-CoV-2 His-tagged Spike protein (Sino Biological, 40589-V08H8). Plates were washed once with wash buffer (0.05% Tween-20 in PBS) and blocked for 2 h at room temperature using a solution of heat-inactivated, IgG-depleted, protease-free bovine serum albumin (2% w/v BSA in PBS). After blocking, plates were washed three times and mouse serum was serially diluted in the blocking solution and incubated for 2 h at r.t. Plates were washed three times before the addition of HRP-conjugated anti-mouse secondary antibody specific to IgG (1:10,000, Abcam, ab97040) in blocking buffer. Plates were incubated for 1.5 h and washed three times before the addition of 100 μ l per well of KPL TMB substrate for 8 min. The reaction was stopped by adding 50 μ l of 2 N sulfuric acid and the absorbance was measured at 450 nm using a SpectraMax 190 microplate reader. Spike-specific IgG end-point dilution titre was defined as the highest dilution of serum to give an optical density (OD) greater than the cut-off OD value determined using the Frey method^{34,51}.

Pseudovirus neutralization assay was performed using a lentivirus-based system expressing the D614G Spike protein (Integral Molecular, RVP-702L). HEK-293/ACE-II cells were seeded at a density of 20.000 cells per well in 96-well plates overnight. Serum samples were serially diluted in RPMI-1640 medium and incubated with an equivalent volume (1:1, v/v) of lentivirus-based pseudovirus expressing Renilla luciferase (50 foci forming units). The lentivirus-serum mixture was incubated at 37 °C for 1 h to allow interaction between neutralizing antibodies and pseudovirus particles. The mixture (100 µl) was then added to HEK-293/ACE-II cells and incubated for 48 h. Luciferase expression was evaluated using the Renilla-Glo Luciferase Assay system (Promega, E2710) according to manufacturer protocols. The 50% neutralization titre (NT₅₀) was determined as the greatest serum dilution at which the luminescence was reduced by 50% relative to control cells treated with the pseudovirus in the absence of serum. NT₅₀ titres for each sample were measured in two technical replicates performed on separate days.

Safety evaluation

Serum was collected at 24 h post treatment of Cas9 mRNA/TTR sgRNA-loaded LNPs (1 mg kg⁻¹) or 31hP-M (a degradation metabolite of 31hP, 5 mg kg⁻¹). ALT and AST activities were determined using the alanine transaminase colorimetric activity assay kit (700260, Cayman) and aspartate aminotransferase colorimetric activity assay kit (701640, Cayman), respectively. Thirteen pro-inflammatory cytokines were examined using a LEGENDplex multi-analyte flow assay kit (BioLegend, 740621) according to manufacturer instruction.

Statistical analysis

Data are presented as mean \pm s.d. Student's *t*-test or one-way analysis of variance (ANOVA) followed by Tukey's test was applied for comparison between two groups or among multiple groups, respectively, using Graphpad Prism 8.0. *P* < 0.05 was considered statistically significant.

Reporting summary

Further information on research design is available in the Nature Portfolio Reporting Summary linked to this article.

Data availability

All relevant data supporting the findings of this study are available within the paper and its Supplementary Information. Source data are provided with this paper.

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Author contributions

X.H. and M.J.M. conceptualized the project. X.H. and M.-G.A. developed the methodology. X.H., M.-G.A., Y.X., R.P., J.X., R.E.-M., G.D., C.C.W. and I.-C.Y. conducted investigations. X.H. and Y.X. performed visualization. M.J.M. acquired funding and supervised the project. X.H. and M.J.M. wrote the original draft. J.X., M.-G.A., Y.X., R.P., L.X., N.G., R.E.-M., K.L.S., Q.S., C.C.W., J.M.W., D.W. and M.J.M. reviewed and edited the manuscript.

Competing interests

X.H. and M.J.M. have filed a patent application based on this work. J.M.W. is a paid advisor to and holds equity in iECURE, Passage Bio, and the Center for Breakthrough Medicines (CBM). He also holds equity in the former G2 Bio asset companies and Ceva Santé Animale. He has sponsored research agreements with Alexion Pharmaceuticals, Amicus Therapeutics, CBM, Ceva Santé Animale, Elaaj Bio, FA212, Foundation for Angelman Syndrome Therapeutics, former G2 Bio asset companies, iECURE, and Passage Bio, which are licensees of Penn technology. J.M.W. and C.C.W. are inventors on patents that have been licensed to various biopharmaceutical companies and for which they may receive payments. The other authors declare no competing interests.

Additional information

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nature portfolio

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For	all st	atistical analyses, confirm that the following items are present in the figure legend, table legend, main text, or Methods section.
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\ge		For Bayesian analysis, information on the choice of priors and Markov chain Monte Carlo settings
\boxtimes		For hierarchical and complex designs, identification of the appropriate level for tests and full reporting of outcomes
\boxtimes		Estimates of effect sizes (e.g. Cohen's d, Pearson's r), indicating how they were calculated
		Our web collection on <u>statistics for biologists</u> contains articles on many of the points above.

Software and code

Policy information about availability of computer code			
Data collection	Bruker 400 MHz NMR spectrometer, Zetasizer Nano ZS90, IVIS spectrum.		
Data analysis	Statistical analysis was performed on Graphpad Prism 8.0, 1H NMR spectrum was analysed by MestReNova x64, in vivo imaging analysis (total flux) was performed on IVIS spectrum, and molecular simulation was performed on BIOVIA Discovery Studio 2018.		

For manuscripts utilizing custom algorithms or software that are central to the research but not yet described in published literature, software must be made available to editors and reviewers. We strongly encourage code deposition in a community repository (e.g. GitHub). See the Nature Portfolio guidelines for submitting code & software for further information.

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Research involving human participants, their data, or biological material

Policy information about studies with <u>human participants or human data</u>. See also policy information about <u>sex, gender (identity/presentation),</u> <u>and sexual orientation</u> and <u>race, ethnicity and racism</u>.

Reporting on sex and gender	The study did not involve human research participants.
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Recruitment	-
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Note that full information on the approval of the study protocol must also be provided in the manuscript.

Field-specific reporting

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Life sciences study design

All studies must disclose on these points even when the disclosure is negative.

Sample size	No statistical methods were used to determine sample sizes. Sample sizes were determined by allowable error size, accuracy, resources, and need for statistical analysis (generally n>=3 throughout all the studies). For initial screening, n=2 was used for rapid and cost-efficient screening of lipid candidates.
Data exclusions	No animals and/or data were excluded.
Replication	All experiments were repeated for at least three times, and the experimental findings were reproducible.
Randomization	For the in vivo study, animal groups were randomized by body weight. For other experiments, all samples were randomly allocated into experimental groups, as there was no covariate in the study design.
Blinding	All the investigators were blinded to group allocation during data collection and analysis.

Reporting for specific materials, systems and methods

We require information from authors about some types of materials, experimental systems and methods used in many studies. Here, indicate whether each material, system or method listed is relevant to your study. If you are not sure if a list item applies to your research, read the appropriate section before selecting a response.

Materials & experimental systems		Methods		
n/a	Involved in the study	n/a	Involved in the study	
	Antibodies	\ge	ChIP-seq	
	Eukaryotic cell lines	\boxtimes	Flow cytometry	
\boxtimes	Palaeontology and archaeology	\boxtimes	MRI-based neuroimaging	
	Animals and other organisms			
\boxtimes	Clinical data			
\boxtimes	Dual use research of concern			
\boxtimes	Plants			

Antibodies

Antibodies used

HRP-conjugated anti-mouse secondary antibody specific to IgG (1:10,000, Abcam, #ab97040).

All antibodies were verified by the supplier, and each lot had been quality-tested. All the antibodies used are from commercial sources, and had been validated by the vendors. Validation data are available on the manufacturer's website.

Eukaryotic cell lines

Policy information about cell lines and Sex and Gender in Research			
Cell line source(s)	HepG2 cells were obtained from American Type Culture Collection (ATCC, #HB-8065).		
Authentication	A short tandem repeat DNA-profiling method was used to authenticate the cell lines, and the results were compared with reference databases.		
Mycoplasma contamination	The cells were tested for mycoplasma contamination. No mycoplasma contamination was found.		
Commonly misidentified lines (See <u>ICLAC</u> register)	No commonly misidentified cell lines were used.		

Animals and other research organisms

Policy information about studies involving animals; ARRIVE guidelines recommended for reporting animal research, and Sex and Gender in Research

Laboratory animals	C57BL/6 female mice (6–8 weeks, 18–20 g) were purchased from The Jackson Laboratory, and housed in a specific-pathogen-free animal facility at ambient temperature (22 ± 2 °C), air humidity 40%–70% and a 12-h dark/12-h light cycle.
Wild animals	The study did not involve wild animals.
Reporting on sex	Female mice were used. Sex should not affect the results.
Field-collected samples	The study did not involve samples collected from field.
Ethics oversight	All animal protocols were approved by the Institutional Animal Care and Use Committee (IACUC) of University of Pennsylvania (#806540), and animal procedures were performed in accordance with the Guidelines for Care and Use of Laboratory Animals at the University of Pennsylvania.

Note that full information on the approval of the study protocol must also be provided in the manuscript.