DIABETES

An ultrafast insulin formulation enabled by high-throughput screening of engineered polymeric excipients

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Insulin has been used to treat diabetes for almost 100 years; yet, current rapid-acting insulin formulations do not have sufficiently fast pharmacokinetics to maintain tight glycemic control at mealtimes. Dissociation of the insulin hexamer, the primary association state of insulin in rapid-acting formulations, is the rate-limiting step that leads to delayed onset and extended duration of action. A formulation of insulin monomers would more closely mimic endogenous postprandial insulin secretion, but monomeric insulin is unstable in solution using present formulation strategies and rapidly aggregates into amyloid fibrils. Here, we implement high-throughputcontrolled radical polymerization techniques to generate a large library of acrylamide carrier/dopant copolymer (AC/DC) excipients designed to reduce insulin aggregation. Our top-performing AC/DC excipient candidate enabled the development of an ultrafast-absorbing insulin lispro (UFAL) formulation, which remains stable under stressed aging conditions for 25 ± 1 hours compared to 5 ± 2 hours for commercial fast-acting insulin lispro formulations (Humalog). In a porcine model of insulin-deficient diabetes, UFAL exhibited peak action at 9 ± 4 min, whereas commercial Humalog exhibited peak action at 25 ± 10 min. These ultrafast kinetics make UFAL a promising candidate for improving glucose control and reducing burden for patients with diabetes.

INTRODUCTION

More than 40 million patients live with type 1 diabetes worldwide and rely on insulin replacement therapy through daily subcutaneous insulin injections or insulin infusion pumps. These patients are unable to produce the insulin required to promote cellular glucose uptake in response to meals and must deliver calculated insulin boluses at mealtimes to prevent glycemic excursions. Unfortunately, the pharmacokinetics of current insulin formulations do not mimic endogenous insulin secretion, which can reach peak concentrations in 30 min in a nondiabetic individual (1-3). Even current rapid-acting insulin (RAI) analogs designed for mealtime boluses exhibit delayed onset of action of 20 to 30 min, peak action at 60 to 90 min, and a total duration of action of 3 to 4 hours (4-6). These kinetics are an outcome of the mixed association states of the insulin molecules in formulation. Commercial insulin formulations typically contain a mixture of insulin hexamers, dimers, and monomers. Whereas monomers are rapidly absorbed into the bloodstream after injection, dimers and hexamers are absorbed more slowly on account of their size and must dissociate into monomers to become active (Fig. 1) (7–9). Further, the extended duration of insulin action can make

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controlling postprandial glycemic excursions difficult and increases the risk of hypoglycemia, as insulin may remain on board even after the mealtime glucose load passes (10, 11).

An insulin formulation that is absorbed rapidly from the subcutaneous space to more closely mimic endogenous postprandial insulin secretion is needed to better control mealtime blood glucose. A monomeric insulin formulation would enable both faster onset and shortened duration of action, thus reducing the risk of postprandial hypoglycemia by eliminating the subcutaneous depot of insulin hexamers (Fig. 1B). However, monomeric insulin is unstable in formulation and rapidly aggregates into amyloid fibrils, which are both inactive and immunogenic (12-14). Presently, zinc and phenolic preservatives are commonly used as excipients in insulin formulations because their propensity to promote insulin hexamer formation enables them to act as stabilizing agents (15, 16). It is critical to develop a class of excipients that can improve insulin stability in the monomeric state to enable a viable ultrafast-acting insulin formulation.

Insulin aggregation typically is initiated at hydrophobic interfaces, such as the air-liquid interface, where monomers undergo partial unfolding upon adsorption and can nucleate amyloid fibril formation (Fig. 1C) (17-19). Hydrophobic moieties responsible for aggregation are typically shielded in the dimeric and hexameric association states, making the monomeric state most susceptible to aggregation (20). Current zinc-free methods for monomeric insulin stabilization have relied on shielding hydrophobic interactions by covalently or non-covalently attaching hydrophilic polymers such as poly(ethylene glycol) (PEG) or trehalose glycopolymers directly to insulin (21-24). These methods stabilize insulin in formulation, but they lead to increased circulation time in vivo, which is undesirable for an ultrafast-acting insulin formulation.

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Fig. 1. Scheme of absorption kinetics of the various association states of insulin. (A) Commercial rapid-acting insulin (RAI) formulations contain a mixture of insulin hexamers, dimers, and monomers. Only the monomeric form of insulin is active; thus, the dissociation from the hexamer to the monomer is rate limiting for therapeutic action. An ultrafast insulin formulation would contain primarily insulin monomers and no insulin hexamers for rapid insulin absorption after subcutaneous administration. (B) A schematic illustrating the contribution of insulin hexamers, dimers, and monomers in commercial RAI formulations to the observed duration of insulin action when delivered subcutaneously in humans. Insulin monomers are absorbed in about 5 to 10 min, dimers are absorbed in 20 to 30 min, and hexamers can take 1 to 2 hours to be absorbed and result in prolonged insulin action accordingly. A primarily monomeric insulin formulation would reduce time to onset and result in shorter duration of insulin action for better management of blood glucose at mealtimes. (C) A hexamer-free ultrafast insulin formulation will face stability challenges due to the propensity for insulin monomers to aggregate into amyloid fibrils. (i) At the interface, exposure of hydrophobic domains during insulin-insulin interaction nucleates amyloid fiber formation. (ii) Stabilizing polymer excipients are drawn to the air-liquid interface, impeding the interfacial nucleation of insulin amyloidosis.

An alternative approach to insulin stabilization exploits the propensity of amphiphilic polymers to occupy the interface, preventing insulin-interface interactions (Fig. 1C). Poloxamers are an example of polymer surfactants that have been used to improve the stability of commercial insulin formulations (Insuman U400, Sanofi-Aventis). Yet, these current excipients comprise a limited chemical space, exhibit a propensity to form microstructures such as micelles in solution, and are susceptible to transitioning into gels at high concentrations, and hence, a stable ultrafast monomeric insulin formulation is still evasive. In this study, we aimed to synthesize a distinct class of excipients that can be used to enable the stable formulation of an ultrafast-acting monomeric insulin. These excipients are synthetic copolymers composed of a water-soluble carrier monomer, chosen to aid polymer solubility, and a functional dopant monomer, which afford the ability to screen a wide chemical space unexplored in current surfactant excipients. The dopant monomer is hypothesized to promote polymer-interface interactions, reducing insulininsulin interactions at the interface and thus improving insulin stability. We used precision high-throughput synthesis with reversible additional fragmentation transfer (RAFT) polymerization to generate a library of more than 100 acrylamide carrier/dopant copolymer (AC/DC) excipients. Here, we demonstrate that top AC/DC excipient candidates enable the stable formulation of monomeric insulin lispro and that this ultrafast-absorbing lispro (UFAL) formulation exhibits pharmacokinetics that are twofold faster than commercial fast-acting insulin formulations in a porcine model of insulindeficient diabetes.

RESULTS

High-throughput synthesis of polyacrylamide library

A library of AC/DC excipients was synthesized combinatorially through statistical copolymerizations of water-soluble carrier monomers and functional dopant monomers (Fig. 2). The carrier monomers were the predominant species and were responsible for both maintaining solubility and providing an inert barrier to prevent insulin-insulin interactions. The functional dopants copolymerized at lower weight percentages were incorporated statistically throughout the resulting copolymer. These dopants are selected by design to promote either polymer-interface interactions or polymer-insulin interactions. The library targets a degree of polymerization (DP) of 50 for the copolymers, resulting in molecular weights similar to insulin and well below the glomerular filtration threshold for synthetic polymers (25).

The library was generated through parallel synthesis with a Chemspeed Swing XL auto synthesizer, a liquid handling robot in an inert environment. RAFT polymerization was implemented because it affords precise copolymerization stoichiometry, low dispersity, and controlled molecular weights for a wide scope of monomers. Poly-acrylamide derivatives were used for both the carrier and dopant monomers due to the scope and availability of commercial water-soluble monomers (carriers) and functional monomers (dopants) and polymeric stability. Although monomeric acrylamide (AM) derivatives often exhibit acute toxicities, when properly purified from their monomeric precursors, polyacrylamide derivatives demonstrate a high degree of biocompatibility (*26, 27*). Moreover, the reactivity ratios between the various acrylamide monomers are close



Fig. 2. Scheme of polymer excipient library design. A library of statistical acrylamide (AM) copolymers with a target degree of polymerization (DP) of 50 was synthesized through controlled copolymerization using RAFT. Copolymer combinations consist of one carrier monomer: 4-acryloylmorpholine (MORPH), *N*-(3-methoxypropyl)acrylamide (MPAM), *N*,*N*-dimethylacrylamide (DMA), *N*-hydroxyethyl acrylamide (HEAM), or AM. Each copolymer also contains one dopant monomer: *N*-[tris(hydroxymethyl)-methyl]acrylamide (TRI), 2-acrylamido-2-methylpropane sulfonic acid (AMP), (3-acrylamidopropyl)trimethylammonium chloride (TMA), *N*-isopropylacrylamide (NIP), *N*-tert-butylacrylamide (TBA), or *N*-phenylacrylamide (PHE). Each carrier-dopant combination was repeated at low, medium, and high dopant loadings: NIP at 6.7, 13.3, and 20 wt %; TRI at 5, 10, and 15 wt %; and AMP, TMA, TBA, and PHE at 3.3, 6.7, and 10 wt %.

to 1, yielding copolymers with little to no dopant gradient composition. Carrier monomers included AM, *N*-hydroxyethyl acrylamide (HEAM), *N*,*N*-dimethylacrylamide (DMA), 4-acryloylmorpholine (MORPH), and *N*-(3-methoxypropyl)acrylamide (MPAM) because they are nonionic and water soluble (ordered in increasing hydrophobicity). Dopant monomers included *N*-[tris(hydroxymethyl)methyl] acrylamide (TRI), 2-acrylamido-2-methylpropane sulfonic acid (AMP), (3-acrylamidopropyl)trimethylammonium chloride (TMA), *N*-isopropylacrylamide (NIP), *N-tert*-butylacrylamide (TBA), and *N*-phenylacrylamide (PHE). These functional dopants could be further classified into hydrogen bonding (TRI), ionic (AMP and TMA), hydrophobic (NIP and TBA), and aromatic (PHE) monomers on the basis of their chemical composition.

A library of 90 AC/DC excipients was synthesized through the combinatorial copolymerization of carrier and dopant monomers at each of three different compositions for a given carrier-dopant pair. NIP was copolymerized at 6.7, 13.3, or 20 weight % (wt %). TRI was copolymerized at 5, 10, or 15 wt %. AMP, TMA, TBA, and PHE were copolymerized at 3.3, 6.7, or 10 wt %. These values were selected to maximize dopant loading while yielding functional copolymers with lower critical solution temperature (LCST) values above 37°C to ensure that they would remain soluble at all relevant temperatures. Polymers were characterized by nuclear magnetic resonance (NMR) and size exclusion chromatography (SEC) (tables S1 and S2 and figs. S1 and S2). Although RAFT polymerization affords many synthetic advantages, it yields polymers with a reactive trithiocarbonate chain transfer agent (CTA) attached at the Z terminus. Accordingly, the CTA moiety on the synthesized AC/DC excipients

was removed before utilization of the copolymers in subsequent assays to ensure their inertness.

High-throughput screen for insulin-stabilizing excipient

After generating the library of AC/DC excipients, each polymer's potential as a stabilizing excipient for insulin was evaluated using an absorbance-based stressed aging assay, in which destabilized insulin aggregates scatter light and increases the absorbance of the solution. Time to aggregation in these assays is defined as a 10% increase in absorbance of the formulation (21). Recombinant insulin was formulated in phosphate-buffered saline (PBS) at standard formulation concentrations (100 U/ml; 3.4 mg/ml) and tested with (i) no polymer excipients, (ii) pluronic L-61 (the commercially available polymer that is most similar both chemically and physically to poloxamer 171 used in Insuman U400), (iii) 1 mg/ml of AC/ DC excipients, or (iv) 10 mg/ml of AC/ DC excipients. Recombinant insulin controls without polymer excipient aggregated in 13 ± 8 hours in this assay. Formulation with pluronic L-61 (1 mg/ ml) prolonged aggregation to 27 ± 2 hours, demonstrating the efficacy of the com-

mercial polymer as an excipient to prevent insulin aggregation. The use of water-soluble carrier homopolymer excipients (1 mg/ml) had no impact on insulin stability (Fig. 3A), demonstrating that free hydrophilic polymers are not sufficient to prevent insulin aggregation. This finding is supported by previous work showing that other hydrophilic polymers such as PEG do not improve insulin stability (21).

Insulin stability when formulated with AC/DC excipients was highly chemistry dependent. Each AC/DC excipient was formulated with insulin, and stability was tested for up to 1 month (Fig. 3, B to G, and table S3). Formulations comprising AC/DC excipients with MPAM and MORPH carrier chemistries demonstrated the overall highest improvement of insulin stabilization, especially when combined with NIP, TBA, and PHE dopants. Although many carrierdopant combinations demonstrated long-term stability at 1 wt % formulation concentrations, we sought to engineer copolymers capable of stabilizing insulin at minimal concentrations in formulation. AC/DC excipients comprising MPAM-PHE, MPAM-TBA, MPAM-TRI, and MORPH-TBA (0.1 wt %) stabilized insulin for more than 100 hours of stressed aging (Fig. 3G). These formulations are therefore sevenfold more stable than recombinant insulin alone and threefold more stable than formulations containing pluronic L-61. Moreover, AC/DC excipients comprising MPAM-NIP, MPAM-AMP, and MORPH-PHE (0.1 wt %) stabilized insulin for 30 days of stressed aging (Fig. 3G), at which point, the assay was terminated. These formulations are 50-fold more stable than insulin alone and 24-fold more stable than formulations containing pluronic L-61. These select carriers and dopants are the most hydrophobic among



Fig. 3. Recombinant insulin stability screen with polymer excipient library. Time to aggregation (t_A) of recombinant insulin (100 U/ml) formulated with (**A**) carrier homopolymers (0.1 wt %) or a pluronic L-61 control (0.1 wt %), which has similar composition to poloxamer 171 used in commercial insulin formulations. Carrier-dopant polymers (0.1 wt %) with (**B**) DMA, (**C**) AM, (**D**) HEAM, (**E**) MPAM, and (**F**) MORPH carriers. Dopants and target weight percentages are listed on the *y* axis. (**G**) Heat map of the top-performing excipient (the largest t_A) for each carrier-dopant combination. Black dashed rectangles indicate the top dopant-carrier combinations, which were selected for further screening. These assays assess the aggregation of proteins in formulation over time during stressed aging (continuous agitation at 37°C by monitoring changes in absorbance at 540 nm). Data shown are average time to aggregation (n = 3; means \pm SD) where aggregation is defined as a 10% increase in absorbance.

the monomers screened, suggesting that amphiphilic water-soluble copolymers are most effective at preventing insulin aggregation.

Stabilization of monomeric insulin with refined screen

On the basis of the initial recombinant insulin stability screen, copolymers comprising MPAM or MORPH carriers with NIP or PHE dopants demonstrated the most promise as candidates for stabilizing monomeric insulin. Previous work by our group demonstrated that the equilibrium between insulin association states can be shifted by altering formulation excipients, where a formulation that is about 70% monomers can be achieved with formulation of zinc-free lispro with glycerol and phenoxyethanol (24). This formulation favors the insulin monomer and completely dissociates the insulin hexamer. Representative SEC traces and multiangle light scattering (MALS) of predominantly hexameric Humalog and predominantly monomeric zinc-free UFAL demonstrate the association states of insulin in formulation (fig. S3 and Fig. 4A). However, insulin monomers are unstable in formulation and require additional stabilizing excipients to be viable for translation. Further, it will likely be prudent to use the lowest concentration of copolymer excipient possible to reduce chronic exposure to the excipient with frequent insulin use typical of diabetes management.

To address this need, a second library of AC/DC excipients was synthesized to evaluate additional carrier-dopant ratios with our top-performing candidate monomers: (i) MPAM and MORPH as carriers and (ii) NIP and PHE as dopants. Standard synthesis practices were implemented to generate this secondary library, which consisted of copolymers at DP50 with MORPH or MPAM as carriers and either (i) NIP loaded at 14, 17, 20, 23, or 26 wt % or (ii) PHE loaded at 6, 8, 10, 12, or 14 wt %, respectively, via SEC and ¹H NMR spectroscopy (fig. S4 and table S4).

Using the AC/DC excipients synthesized in the second screen, UFAL formulations were prepared with 0.01 wt % (0.1 mg/ml) copolymer excipient, and insulin aggregation was assessed under stressed conditions using the same assay as the initial screen (table S5). Humalog, the commercial formulation of insulin lispro, aggregated under these conditions within 6 hours. UFAL without AC/DC excipients aggregated in 1.3 ± 0.3 hours, demonstrating the severe instability of the insulin monomer in solution. All UFAL formulations stabilized with MORPH-PHE or MPAM-PHE AC/ DC excipients exhibited stabilities to

stressed aging at least equivalent to commercial Humalog. Copolymers comprising MPAM with 14 wt % PHE (MPAM-PHE_{14%}) and MORPH with 12 wt % PHE (MORPH-PHE_{12%}) were among the top candidates, extending UFAL formulation stability to 27 ± 2 hours and 25 ± 5 hours, respectively (Fig. 4, B and C). MPAM-NIP copolymers demonstrated limited efficacy in stabilizing the monomeric insulin; however, MORPH-NIP copolymers extended monomeric insulin stability compared to Humalog. Copolymers comprising MORPH with 23 wt % NIP (MORPH-NIP_{23%}) extended UFAL formulation stability to more than 25 ± 1 hours. The top candidate AC/DC excipients after the second screen were MPAM-PHE_{14%}, MORPH-PHE_{12%}, and MORPH-NIP_{23%}. Whereas these copolymers demonstrated high efficacy, MPAM-PHE_{14%} and MORPH-PHE_{12%} also demonstrated



Fig. 4. Stabilized UFAL formulation using top-performing AC/DC polymer excipients. (**A**) Insulin association states in (i) Humalog and (ii) UFAL as determined by multiangle light scattering (MALS). (**B**) UFAL stability screen with polymer excipient library. Time to aggregation of UFAL (100 U/ml) formulated with polymer excipients from the second screen (0.01 wt %). AC/DC polymer excipients were composed of MPAM and MORPH carrier polymers with varied weight percent of dopants (i) PHE or (ii) NIP. (**C**) Representative absorbance traces showing UFAL stability when formulated with top-performing candidate MORPH-NIP_{23%} compared to controls of UFAL with no polymer excipient and Humalog. These assays assess the aggregation of proteins in formulation over time during stressed aging (continuous agitation at 37°C) by monitoring changes in transmittance at 540 nm. Data shown are average time to aggregation (*n* = 3; means ± SD) where aggregation is defined as a 10% increase in absorbance. Abs, absorbance. (**D**) Diffusion-ordered NMR spectroscopy (DOSY) of UFAL with top-performing polymer excipient MORPH-NIP_{23%}. DOSY provides insight into the insulin association state and the insulin and polymer rates of diffusion in formulation. ppm, parts per million.

mechanism of our polymer excipients. MORPH-NIP_{23%} diffuses at a slower rate than insulin, suggesting that the mechanism of stabilization is not related to excipient-insulin complexation and codiffusion. These data support our hypothesis that copolymer-interface interactions are the primary mechanism driving monomeric insulin stabilization in formulation.

Cytotoxicity and biocompatibility of polymer excipients

Because Morph-NIP23% is a new chemical entity, we sought to assess potential toxicity of the polymer and biocompatibility of the UFAL formulation. Cytotoxicity experiments performed in NIH/3T3 mouse fibroblasts demonstrate that our copolymer excipient is not toxic at doses an order of magnitude higher than those used in insulin formulations (fig. S6). Initial biocompatibility studies with UFAL compared to Humalog in diabetic rats also corroborate the cytotoxicity results, indicating that UFAL should be well tolerated (fig. S7). Two groups of diabetic rats (n = 5) received a single daily dose of either Humalog (1.5 U/kg) or UFAL (1.5 U/kg) for seven consecutive days. Blood was taken on day 0 and on day 7, and blood chemistry was evaluated to assess common markers of liver and kidney health. Liver toxicity was assessed through measurement of alanine aminotransferase, aspartate aminotransferase, alkaline phosphotase, and bilirubin. Kidney toxicity was evaluated by examining creatinine and blood urea nitrogen levels. Some markers elevated outside of the normal range for healthy rats were attributable

decreased solubility and LCST-like phase separation behavior at physiological temperature when present at higher concentrations. Thus, MORPH-NIP_{23%} was chosen as the top candidate used to stabilize our UFAL formulation in subsequent in vivo studies. In vitro and in vivo bioactivity assays were used to corroborate the transmittance data and confirm UFAL integrity before and after aging. UFAL showed no loss in activity after 12 hours of stressed aging in either the cellular assay for phosphorylation of Ser⁴⁷³ on AKT or when lowering blood glucose concentration in diabetic rats (fig. S5).

To verify that formulation with MORPH-NIP_{23%} does not alter the lispro association state equilibrium away from the monomer form, NMR diffusion-ordered spectroscopy (DOSY) was used (Fig. 4D). NMR DOSY indicates the diffusion rate of lispro under formulation conditions [lispro (100 U/ml), 2.6 wt % glycerol, 0.85 wt % pheno-xyethanol, and 0.1 wt % MORPH-NIP_{23%}] and has a diffusion rate of 2.0×10^{-10} m² s⁻¹. This diffusion rate corresponds to a hydrodynamic radius of 1.2 nm, which is in agreement with the experimental hydrodynamic radius of the insulin monomer previously reported (*28*). NMR DOSY also provides insight into the stabilization

to the diabetic phenotype. No differences were observed between Humalog and UFAL groups at either day 0 or day 7 time point.

Pharmacokinetics and pharmacodynamics of UFAL formulation in diabetic pigs

To assess the ultrafast potential of the monomeric insulin formulations, we conducted pharmacokinetic studies in a porcine model of insulin-deficient diabetes. Fasted diabetic pigs were treated with either commercial Humalog or UFAL [lispro (100 U/ml), 2.6 wt % glycerol, 0.85 wt % phenoxyethanol, and 0.1 wt % MORPH-NIP_{23%}) at a dose of 2 to 4 U of insulin lispro, depending on the insulin sensitivity of each pig. Pigs had a starting blood glucose concentration between 330 and 430 mg/dl, and insulin doses were chosen to reduce blood glucose to about 100 mg/dl. The insulin dose given to each pig was consistent between treatment groups, and blood glucose depletion was similar in both Humalog and UFAL treatments (Fig. 5A and fig. S8). Plasma concentrations of lispro were measured over time by enzymelinked immunosorbent assay (ELISA) to assess pharmacokinetics after subcutaneous injection of each of the treatment groups. No difference



Fig. 5. Pharmacokinetics and pharmacodynamics of monomeric insulin in diabetic pigs. Diabetic female pigs received subcutaneous administration of therapies comprising either commercial Humalog or UFAL formulated with polymer. Pigs were dosed with insulin according to their individual insulin sensitivities to decrease their blood glucose by about 200 mg/dl. (**A**) Blood glucose measurements in pigs after insulin were dosed subcutaneously. (**B**) Pharmacokinetics of insulin lispro in milliunit per liter after subcutaneous injection. (**C**) Total exposure represented by area under the curve for 210 min (AUC₂₁₀). (**D** to **I**) Percent exposure at various time points (AUC_t/AUC₂₁₀). (**J**) Pharmacokinetics for each pig were individually normalized to peak concentrations, and normalized values were averaged for lispro concentration for each treatment group. (**K**) Time to reach 50% of peak lispro concentration (onset). (**L**) Time to reach peak lispro concentration. (**M**) Time for lispro depletion to 50% of peak concentration. (**A**, **B**, and **J**) Error bars indicate means ± SD with *n* = 5 for all groups. (D to **I**) Error bars indicate means ± SEM with *n* = 5 for all groups. (Concentration are points, and significance and α were adjusted ($\alpha = 0.008$). (C and K to M) Error bars indicate means ± SEM with *n* = 5 for all groups. (Statistical significance was determined by restricted maximum likelihood repeated measures mixed model.

in overall exposure from the area under the curve for 210 minutes (AUC_{210}) between groups was observed (Fig. 5C). Percent exposure at various time points was analyzed by looking at the AUC_t/AUC_{210} . This analysis shows increased exposure for UFAL compared to Humalog at 10 and 20 min time points (Fig. 5, D to I).

Mean residence time (MRT) is commonly reported for formulation pharmacokinetics. MRT is commonly described as the area under the moment curve (AUMC) divided by AUC for intravenous injections; however, when drugs are administered subcutaneously, the mean absorption time (MAT) must also be considered. When there is an absorption phase, AUMC/AUC = MAT + MRT. Here, we would be interested in the contribution of MAT, as this would indicate differences in absorption rate. The ratio of the AUMC/ AUC for the pharmacokinetic plot was calculated and plotted, showing no difference between UFAL and Humalog treatment (fig. S9). This is not surprising, as we would expect the clearance rate from the blood to be similar for both Humalog and UFAL (both are insulin lispro), and the magnitude of MAT in comparison to MRT would be small, thereby masking differences between formulations.

Alternatively, exposure metrics are commonly reported for fastacting insulin formulations to describe the formulation pharmacokinetics (5, 29–32). The "time-to-onset" rate of fast-acting insulins is often determined using two metrics: (i) time to 50% of the normalized peak height on the way up after administration (denoted "50%-up") and (ii) time-to-peak insulin plasma concentration. Normalized plasma concentration measurements were used to compare the time-to-peak lispro concentrations between commercial Humalog and UFAL treatment groups (Fig. 5, J to M). Pigs exhibited almost twofold faster Humalog pharmacokinetics compared to humans. UFAL demonstrated faster absorption than Humalog, whereby UFAL time to 50% of peak up (5 \pm 2 min) was 2.4-fold faster than Humalog (12 \pm 6 min), and UFAL time to peak (9 \pm 4 min) was 2.8-fold faster than Humalog (25 \pm 10 min). The exposure duration, defined as the time to 50% of the normalized peak height on the way down after peak exposure concentrations (time to 50% peak down), for UFAL (28 \pm 8 min) was 1.9-fold shorter than for Humalog (54 \pm 21 min).

Modeling UFAL pharmacokinetics in humans

Α

To better understand how the fast onset and short duration demonstrated by UFAL in pigs would translate to humans, we adapted a pharmacokinetic model from Wong *et al.* (*33*) to approximate UFAL pharmacokinetics in humans. The model is constructed such that RAI analogs (Humalog) injected into the subcutaneous space (I_{inj}) dissociate and diffuse with a rate constant, k_1 , into the interstitium (I_{eq}); absorb with a rate constant, k_2 , into the plasma (I_p); and are subsequently cleared by several mechanisms that can, nonetheless, be approximated by a single elimination constant, k_3 (Fig. 6A). We assume that k_2 and k_3 are species dependent, k_1 is formulation and species dependent, and the ratio of k_1 between formulations is species inde-

1

pendent. Because the UFAL formulation is composed of insulin monomers and dimers, the time necessary to reach equilibrium in the interstitium is expected to be appreciably lower than for Humalog. When fitting the experimental pig pharmacokinetics for subcutaneous administration of UFAL, we found that k_1 trended toward infinity, meaning that UFAL effectively bypasses the first model compartment and the insulin monomers reach equilibrium in the subcutaneous space immediately (table S6). The fits for the pig pharmacokinetic data for both UFAL and Humalog are presented in Fig. 6B, and a comparison between the model predictions and experimental data with relevant pharmacokinetic metrics is presented in fig. S10. The infinitely large k_1 determined for UFAL in pigs was translated to a human pharmacokinetic model and used to estimate UFAL pharmacokinetics while maintaining k_2 and k_3 values reported in the literature (Fig. 6C) (33).

The model predicts a human UFAL time to onset (50% and up) of 2.5 min, a peak exposure at 10 min, and a duration of exposure (50% and down) of 28 min (Fig. 6D). In comparison, using parameters reported in the literature, the model predicts RAI analogs,



Fig. 6. Pharmacokinetic modeling of UFAL in humans. (A) A model of insulin plasma concentrations after injection in human patients was adapted from Wong *et al.* (33). Rapid-acting insulin analogs are injected into the subcutaneous space (l_{inj}) , then dissociate and diffuse (k_1) into the interstitium (l_{eq}) where they are then absorbed (k_2) into the plasma (l_p) , and ultimately cleared (k_3) . (**B**) Normalized pharmacokinetic data for Humalog and UFAL in diabetic pigs (n = 5 pigs per group) modeled using a least squares fit to determine k_1 , k_2 , and k_3 in pigs (fig. S10 and table S6). (**C**) Human clinical Humalog pharmacokinetic data (n = 3; number of external studies analyzed) compared to modeled RAI analog kinetics (using known human parameters; table S6) (33) and the predicted kinetics of UFAL in humans. UFAL human pharmacokinetic data for Humalog and UFAL. The human UFAL pharmacokinetics was then plotted by using the estimated k_1 with the known k_2 and k_3 parameters. (**D**) Model-predicted kinetics of RAI and UFAL compared to Humalog kinetics in published clinical studies (n = 3; number of external studies analyzed) (29, 30, 34), (i) time to 50% of peak up, (ii) time to peak and duration of action, and (iii) time to 50% of peak down. (**E**) Comparison of the model-predicted time to peak for UFAL in humans compared to human clinical data for commercial RAI formulations (Humalog n = 4; NovoLog n = 6; Apidra n = 3; Fiasp n = 4; BioChaperone Lispro n = 2; where n is the number of external studies analyzed) (5, 29–32, 34–38). Error bars show SD.

such as Humalog, to exhibit a time to onset of 14 min, a peak exposure at 43 min, and a duration of exposure of 157 min (Fig. 6C). Although the RAI model underestimates the time to onset of exposure (t50% up), the predicted curve robustly captures published clinical pharmacokinetic data for peak and duration of Humalog exposure (29, 30, 34). The pharmacokinetic modeling, therefore, predicts UFAL to exhibit kinetics that are more than fourfold faster than current RAI formulations. Further comparison to clinical data for RAI formulations demonstrates that UFAL is predicted to be faster than even second-generation RAI formulations such as Fiasp (Novo Nordisk) and BioChaperone Lispro (Adocia) (Fig. 6E) (5, 29, 31, 32, 35–38).

DISCUSSION

In this study, we report the development of a stable UFAL formulation using an AM-based copolymer as a stabilizing excipient for monomeric insulin. PEG polymers have been traditionally used in drug delivery because of their water solubility and biocompatibility, but recent concerns around immunogenicity are beginning to limit their use (39). In contrast, AM copolymers are emerging as alternative biomaterials for drug delivery systems (26, 39), as many such copolymers have been shown to be nontoxic and more stable under physiological conditions than PEG-based excipients (27, 39, 40). Using a high-throughput screen of a large library of combinatorial AM-based copolymer excipients, we identified several candidate copolymers that act as simple stabilizing agents for insulin formulations. These copolymers enhance insulin formulation stability without any proteinmodifying effects, thus eliminating concerns of reduced insulin activity or extended circulation times typically associated with covalent insulin modification (PEGylation). We hypothesized that statistical copolymers comprising a water-soluble carrier monomer and a functional dopant monomer would act as stabilizing excipients to reduce insulin interactions with the air-liquid interface, thus preventing insulin aggregation and enabling the stable formulation of insulin in its monomeric form and ultrafast kinetics in vivo. A monomeric insulin formulation comprising our top-performing excipient, MORPH-NIP_{23%}, is stable against stressed aging for more than 24 hours, which is almost fourfold longer than commercial Humalog.

In diabetic pigs, this UFAL formulation exhibited ultrafast pharmacokinetics, with about twofold faster time to onset and twofold shorter duration of exposure than Humalog, a commercial RAI formulation using the same insulin molecule lispro. These results suggest that this UFAL formulation more closely mimics endogenous insulin secretion in healthy individuals and highlight that this formulation is promising for enhancing diabetes management. Even the incremental improvement in pharmacokinetics over current "fastacting" insulin formulations observed for Fiasp, a faster-acting version of NovoLog (commercial aspart formulation), has shown numerous clinical benefits (41, 42). Although Fiasp shows a modest 10-min reduction in time to peak action and 15-min reduction in duration of action over RAI formulations (43), Fiasp use, nevertheless, reduced postprandial glucose excursions and reduced hemoglobin A1c concentrations in patients with diabetes (41). In contrast, in diabetic pigs, where insulin pharmacokinetics are twice as fast as in humans, UFAL reduced time-to-peak exposure by 16 min and reduced duration of exposure by 26 min compared to Humalog. The results observed in diabetic pigs, combined with the model-predicted human UFAL pharmacokinetics, suggest that UFAL may have absorption kinetics that are unprecedented in an injectable insulin formulation. If realized in human clinical studies, then these kinetics would be approaching the ultrafast kinetics of Afrezza, the commercially available inhalable insulin (44). However, unlike Afrezza, UFAL is an injectable formulation, which enables more accurate dosing regimens and compatibility with pump and closed-loop systems, providing UFAL the potential to improve postprandial glycemic control in patients with diabetes.

Together these studies identify a promising copolymer excipient for protein stabilization and show its utility in stabilizing a UFAL formulation. This study is limited in that there is no way to know the true pharmacokinetics of UFAL in humans beyond predictive modeling until it is translated to the clinic. Pigs are a good model for subcutaneous pharmacokinetics; however, insulin still exhibits shorter duration of action in pigs than is typically observed in humans (2 hours in pigs versus 4 hours in humans) (45-47). Ultimately, it is possible that these faster absorption kinetics in pigs may mask differences in blood glucose depletion between Humalog and UFAL and may account for the lack of observed pharmacodynamic differences (blood glucose) between formulations in this study. Further, although initial cytotoxicity and biocompatibility experiments performed in this study suggest that our copolymer excipient has a promising toxicity profile, clinical translation will require rigorous study of MORPH-NIP23% biocompatibility and check for formulation immunogenicity. Our stable ultrafast insulin formulation has the potential to improve diabetes management and reduce patient burden around mealtime glucose management.

MATERIALS AND METHODS Study design

The objective of this study was to assess an insulin lispro formulation, UFAL, and compare its pharmacokinetics to a commercial insulin lispro formulation (Humalog). To stabilize a UFAL formulation, a library of polyacrylamide derivative excipients was synthesized and characterized. These excipients were evaluated for their ability to prevent recombinant and monomeric insulin aggregation under accelerated aging conditions. The top-performing excipient was selected for UFAL formulation. Blood glucose and plasma lispro concentrations were measured using a handheld blood glucose monitor or ELISA on collected blood samples after subcutaneous administration of either Humalog or UFAL in pigs. Randomization: Five pigs were used for this study and each pig received each formulation once. The order in which the formulations were given in was randomized. Blinding: For analysis of pharmacokinetic parameters (t50% up, time to peak, t50% down), pharmacokinetic curves were coded and were analyzed by a blinded researcher. Replication: Five pigs were used in this study and each pig acted as its own control receiving each formulation (Humalog and UFAL) once.

Materials

Solvents *N*,*N*-dimethylformamide (DMF; >99.7%; HPLC grade, Alfa Aeser), ethanol (EtOH; >99.5%; Certified ACS, Acros Organics), acetone (>99.9%; Sigma-Aldrich, HPLC Grade), hexanes (>99.9%; Thermo Fisher Scientific, Certified ACS), ether (anhydrous, >99%; Sigma-Aldrich, Certified ACS), and CDCl₃ (>99.8%; Acros Organics) were used as received. Monomers DMA (99%; Sigma-Aldrich), MPAM (95%; Sigma-Aldrich), MORPH (>97%; Sigma-Aldrich), AM (>99%; Sigma-Aldrich), and HEAM (>97%; Sigma-Aldrich) were filtered with basic alumina before use. Monomers PHE (99%; Sigma-Aldrich),

TBA (97%; Sigma-Aldrich), NIP (>99%; Sigma-Aldrich), and TRI (93%; Sigma-Aldrich) were used as received. TMA (75%; Sigma-Aldrich) was washed with ethyl acetate. AMP (99%; Sigma-Aldrich) was converted to the sodium salt through equimolar mixing with sodium acetate in methanol (MeOH) and precipitated into acetone. RAFT CTAs 2-cyano-2-propyl dodecyl trithiocarbonate (2-CPDT; >97%; Strem Chemicals) and 4-((((2-carboxyethyl)thio)carbonothioyl)thio)-4-cyanopentanoic acid (BM1433; >95%; Boron Molecular) were used as received. Initiator 2,2'-azobis(2-methyl-propionitrile) (AIBN; >98%; Sigma-Aldrich) was recrystallized from MeOH (>99.9%; Thermo Fisher Scientific, HPLC grade) and dried under vacuum before use. Initiator 4,4-azobis(4-cyanovaleric acid) (ACVA; >98%; Sigma-Aldrich) was used as received. Z group removing agents lauroyl peroxide (LPO; 97%; Sigma-Aldrich) and hydrogen peroxide (H₂O₂; 30%; Sigma-Aldrich) were used as received.

Synthesis of first copolymer library via automated parallel synthesis

Copolymerizations of carriers and dopants were carried out using RAFT polymerization ([total monomer]/[CTA] = 50, [CTA]/[AIBN] = 0.2). MPAM, MORPH, and DMA carrier monomers copolymerized with AMP, TMA, NIP, TBA, or PHE dopant monomers were polymerized in DMF using 2-CPDT as the CTA and AIBN as the initiator. MPAM, MORPH, and DMA carrier monomers copolymerized with TRI dopant monomer were polymerized in a DMF/ water mixture using BM1433 as the CTA and ACVA as the initiator. Total vinyl monomer molarity was held at 2.72 M (MPAM copolymerizations), 2.86 M (MORPH copolymerizations), and 3.84 M (DMA copolymerizations) such that the homopolymerization of the carrier monomer in DMF would be carried at a constant 40 wt %. HEAM carrier monomer copolymerized with AMP, TMA, NIP, TBA, or PHE dopant monomers were polymerized in DMF/EtOH mixture using 2-CPDT as the CTA and AIBN as the initiator. HEAM carrier monomer copolymerized with AMP, TMA, NIP, TBA, or PHE dopant monomers were polymerized in DMF/EtOH/water mixture using BM1433 as the CTA and ACVA as the initiator. Total vinyl monomer molarity was held at 2.58 M (HEAM copolymerizations) such that the homopolymerization of HEAM in DMF would be carried at a constant 30 wt %. AM carrier monomer copolymerized with AMP, TMA, NIP, TBA, or PHE dopant monomers were polymerized in DMF/water mixture using BM1433 as the CTA and ACVA as the initiator. AM carrier monomer copolymerized with TRI dopant monomer was polymerized in water using BM1433 as the CTA and ACVA as the initiator. Total vinyl monomer molarity was held at 4.05 M (AM copolymerizations) such that the homopolymerization of AM in DMF would be carried at a constant 30 wt %.

Reaction mixtures were prepared by combining stock solutions: (i) carriers, (ii) dopants, and (iii) CTA and initiator. The stock solutions of carrier monomers were HEAM (555 mg/ml in EtOH), AM (462 mg/ml in water), MPAM (818 mg/ml in DMF), DMA (no solvent dilution), and MORPH (no solvent dilution). The stock solutions of dopant monomers were TRI (181 mg/ml in water), PHE (120 mg/ml in DMF), NIP (245 mg/ml in DMF), TBA (122 mg/ml in DMF), AMP (120 mg/ml in DMF), and TMA (124 mg/ml in DMF). Stock solutions of CTA and initiator were prepared such that [CTA]/[initiator] = 5 for AM (BM1433 at 310 mg/ml in water), HEAM and MPAM (BM1433 at 198 mg/ml in water and 2-CPDT at 221 mg/ml in DMF), MORPH (BM1433 at 220 mg/ml in water and 2-CPDT at 247 mg/ml in DMF), and DMA (BM1433 at 220 mg/ml in water and 2-CPDT at 332 mg/ml in DMF). Reaction mixtures of HEAM, DMA, MPAM, and MORPH were diluted with DMF, whereas reaction mixtures of AM were diluted with water to reach the desired vinyl monomer concentration.

Parallel syntheses of AC/DC excipients were conducted on a Chemspeed Swing XL automated synthesizer robot equipped with a 4-Needle Head tool and an iSynth reactor. The reactions were performed in 8-ml disposable ISynth reactor vials. All aspirations and dispensing reagent solutions were performed using the 4-Needle Head tool equipped with a 2 by 10 ml and 2 by 1 ml syringes fitted with septa piercing needles, with both the 1- and 10-ml syringes used in this particular experiment. All solvent lines were primed with 60 ml (six strokes of syringe volume) of degassed DMF. Typical aspiration and dispense rates of the reagents were 10 ml/min for both the 1-ml syringes. An airgap of 50 µl and an extra volume of 50 µl were used for the 1-ml syringes, and an airgap of 50 µl and an extra volume of 100 µl were used for the 10-ml syringes during aspirations using the 4-Needle Head tool. The needles and lines were rinsed after each reagent dispense task with 3-ml inside and outside volume of the priming solvent for the 1-ml syringes and with 20-ml inside and outside volume of the priming solvent for the 10-ml syringes. The DMF reservoir was degassed by continuous nitrogen sparging. All stock solutions were prepared in septa-capped reagent vials and degassed by sparging with argon for 15 min before transfer into the Chemspeed. The atmosphere within the Chemspeed was reduced to <1% oxygen by purging with nitrogen while exhaust ports were closed. Reactor vials were exposed to nitrogen flow until the start of the reaction. The calculated aliquots of stock solutions and solvent were transferred to the reactors via the automated liquid handling system. Upon dispensing, reactor vials were manually sealed in the inert atmosphere, removed from the Chemspeed, manually shaken to combine reagents, and heated to 65°C in an oven for 24 hours, after which, reaction vials were cooled to room temperature and exposed to air.

A procedure to remove the CTA Z groups from the AC/DC excipients containing MORPH, DMA, HEAM, and MPAM copolymers was adapted from the literature (48). The reaction vial was diluted to 6 ml with DMF. LPO [2 equivalents (eq.)] and AIBN (20 eq.) were added to the reaction mixture, which was sealed with a cap using a polytetrafluoroethylene (PTFE) seal. The reaction mixture was sparged with nitrogen gas for 10 min while heating at 90°C and subsequently heated for 12 hours at 90°C. A procedure to remove the CTA Z groups from the AC/DC excipients containing AM copolymers was adapted from the literature (49). The reaction vial was diluted to 5 ml with Milli-Q water. H_2O_2 (20 eq.) was added to the reaction vial, which was sealed and heated to 60°C for 12 hours. The resulting copolymers were isolated by precipitation as outlined below.

AC/DC excipients synthesized with AM and HEAM carriers were precipitated twice from acetone. AC/DC excipients synthesized with DMA and MORPH were precipitated twice from diethyl ether. AC/DC excipients synthesized with MPAM were precipitated twice from diethyl ether and hexane (3:1 ratio) mixtures. The number (M_n) and weight (M_w) average molecular weights and dispersity for the AC/ DC excipients containing MORPH, MPAM, DMA, and HEAM were determined using SEC in DMF with PEG standards. M_n , M_w , and dispersity for the AC/DC excipients containing AM were determined using aqueous SEC-MALS.

Synthesis of second polymeric library

A typical procedure to synthesize a MORPH-NIP AC/DC excipient is as follows and is nearly identical for all other carrier/dopant combinations,

where only the carrier/dopant selection and concentration are changed. MORPH (645 mg, 4.57 mmol, 41.5 eq.), NIP (105 mg, 0.93 mmol, 8.5 eq.), 2-CPDT (38 mg, 0.11 mmol, 1 eq.), and AIBN (3.6 mg, 0.02 mmol, 0.2 eq.) were combined and diluted with DMF to a total volume of 2.25 ml [33.3 (w/v) vinyl monomer concentration] in an 8-ml scintillation vial equipped with a PTFE septa. The reaction mixture was sparged with nitrogen gas for 10 min and then heated for 12 hours at 65°C. To remove the Z terminus of the resulting polymer, AIBN (360 mg, 2.2 mmol, 20 eq.) and LPO (88 mg, 0.22 mmol, 2 eq.) were added to the reaction mixture, which was then sparged with nitrogen gas for 10 min and heated for 12 hours at 90°C (43). Z group removal was confirmed by the ratio of the refractive index to ultraviolet ($\lambda = 310$ nm) intensity in SEC analysis. Resulting polymers were precipitated three times from ether and dried under vacuum overnight. Resulting composition and molecular weights were determined via ¹H NMR spectroscopy and SEC with PEG standards.

Copolymer molecular weight characterization

 $M_{\rm n}$, $M_{\rm w}$, and dispersity for copolymers with HEAM, DMA, MPAM, and MORPH carrier monomers were determined via SEC implementing PEG standards (American Polymer Standards Corporation) after passing through two SEC columns [inner diameter, 7.8 mm; $M_{\rm w}$ range, 200 to 600,000 g mol⁻¹; Resolve Mixed Bed Low divinylbenzene (DVB) (Jordi Labs)] in a mobile phase of DMF with 0.1 M LiBr at 35°C and a flow rate of 1.0 ml min⁻¹ [Dionex UltiMate 3000 pump, degasser, and autosampler (Thermo Fisher Scientific)].

 M_n , M_w , and dispersity for copolymers with AM were determined via SEC-MALS after passing through a SEC column [5000 to 5,000,000 g mol⁻¹; Superose 6 Increase 10/300 GL (GE Healthcare)] in a mobile phase of PBS containing 300 parts per million of sodium azide. Detection consisted of an Optilab T-rEX (Wyatt Technology Corporation) refractive index detector operating at 658 nm and a TREOS II light scattering detector (Wyatt Technology Corporation) operating at 659 nm. The specific refractive index increment (dn/dc) value for AM copolymers was assumed to be 0.185 in this media.

In vitro insulin stability

Methods for aggregation assays for recombinant human insulin were adapted from Webber *et al.* (21). Briefly, formulation samples (3.4 mg/ml) were plated at 150 µl per well (n = 3 per group) in a clear 96-well plate and sealed with optically clear and thermally stable seal (VWR). The plate was immediately placed into a plate reader and incubated with continuous shaking at 37°C. Absorbance readings were taken every 10 min at 540 nm for 100 hours (BioTek Synergy H1 microplate reader). The aggregation of insulin leads to light scattering, which results in an increase in the measured absorbance. The time-to-aggregation (t_A) was defined as the time at which a greater than 10% increase in absorbance from the absorbance at time zero was observed (21). After 100 hours, the plate was removed from the plate reader and transferred to an incubator shaker plate where it was subjected to continued stressed aging. Absorbance readings were taken periodically for up to 30 days.

For the initial high-throughput stability screen, recombinant human insulin (Gibco) was formulated in PBS (0.9 wt % NaCl), and AC/DC excipients were added at concentrations of 1 or 10 mg/ml to the recombinant insulin formulation for a final insulin concentration of 3.4 mg/ml. Each plate contained a recombinant insulin control with no polymer added. For the secondary stability screen with UFAL formulations, control groups included (i) commercial Humalog (Eli Lilly), (ii) zinc-free lispro comprising phosphate buffer, glycerol (2.6 wt %), and phenoxyethanol (0.85 wt %). Zinc (II) was removed from commercial insulin formulations through competitive binding by addition of EDTA, which exhibits a dissociation binding constant approaching attomolar concentrations ($K_D \sim 10^{-18}$ M) (50). EDTA was added to formulations (1 eq. with respect to zinc) to sequester zinc from the formulation. After zinc sequestration, PD MidiTrap G-10 gravity columns (GE Healthcare) were used to remove the zinc/EDTA complexes and other formulation excipients. Lispro was concentrated using Amino Ultra 3K centrifugal units (Millipore) and then reformulated at 100 U/ml with phosphate buffer (10 mM), glycerol (2.6 wt %), phenoxyethanol (0.85 wt %), and AC/DC excipient (0.01 wt %).

NMR DOSY

¹H two-dimensional DOSY spectra were recorded at an insulin lispro concentration of 3.4 mg/ml with 40 wt % D2O for UFAL formulation comprising phosphate buffer, glycerol (2.6 wt %), phenoxyethanol (0.85 wt %), and MORPH-NIP_{23%} copolymer (0.1 wt %). A Varian Inova 600 MHz NMR instrument was used to acquire the data. Magnetic field strengths ranging from 2 to 57 G cm⁻¹. The DOSY time and gradient pulse were set at 132 ms (Δ) and 3 ms (δ), respectively. All NMR data were processed using MestReNova 11.0.4 software.

Streptozotocin-induced diabetes in pigs

Five female Yorkshire pigs (Pork Power) were used for our animal studies, which were performed in accordance with the Guidelines for the Care and Use of Laboratory Animals and the Animal Welfare Act Regulations. All protocols were approved by the Stanford Institutional Animal Care and Use Committee. Type 1–like diabetes was induced in pigs (25 to 30 kg) using streptozotocin (STZ) (MedChemExpress). STZ was infused intravenously at a dose of 125 mg/kg, and animals were monitored for 24 hours. Food and administration of 5% dextrose solution was given as needed to prevent hypoglycemia. Diabetes was defined as fasting blood glucose greater than 300 mg/dl.

In vivo pharmacokinetics and pharmacodynamics in diabetic pigs

Five diabetic pigs were fasted for 4 to 6 hours. Pigs were injected subcutaneously with a 2- to 4-U dose of the following formulations: (i) Humalog (100 U/ml; Eli Lilly) or (ii) UFAL [Zn-free lispro (100 U/ml), 2.6 wt % glycerol, 0.85 wt % phenoxyethanol, and 0.01 wt % MORPH-NIP $_{23\%}$]. Doses were determined on the basis of individual pig insulin sensitivity values with a target of a decrease in blood glucose of about 200 mg/dl. Individual pigs received the same dose for each treatment group. Pigs received each formulation once on separate days, and the order of the treatment groups was randomized. Before injection, baseline blood was sampled from an intravenous catheter line and measured using a handheld glucose monitor (Bayer Contour Next). After injection, blood was sampled from the intravenous catheter line every 5 min for the first 60 min and then every 30 min up to 4 hours. Blood was collected in K2EDTA plasma tubes (Greiner Bio-One) for analysis with ELISA. Plasma lispro concentrations were quantified using an Insulin Lispro ELISA kit (Mercodia).

Pharmacokinetic modeling

The pharmacokinetic model used in this analysis was derived from literature reports (33). Insulin concentrations for injection (I_{inj}), equilibrium in the interstitium (I_{eq}), and the plasma (I_p) were numerically solved using a system of differential equations, outlined below, as a function of time using the SciPy (version 1.2.1) odeint function in Python (version 3.6.8)

$$\frac{d[I]_{\rm inj}}{dt} = -k_1 * I_{\rm inj} \tag{1}$$

$$\frac{d[I]_{eq}}{dt} = k_1 * I_{inj} - k_2 * I_{eq}$$
(2)

$$\frac{d[I]_{\rm p}}{dt} = k_2 * I_{\rm eq} - k_3 * I_{\rm p}$$
(3)

Concentrations were initialized such that at t = 0, all insulin was present in Iinj. Kinetic rate constants were fit for the normalized pig pharmacokinetic curves by minimizing the sum of squared errors (SSEs) between the generated, normalized insulin plasma concentrations derived from the model at the experimental time points from 0 to 90 min and the normalized pig plasma insulin concentrations for UFAL and Humalog. We assume that k_2 and k_3 are species dependent, whereas k_1 is both species and formulation dependent. While minimizing the SSE, we observed that there was no upward bound for $k_{1,\text{UFAL},\text{Pig}}$; such that higher values of $k_{1,\text{UFAL},\text{Pig}}$ resulted in increasingly marginally smaller SSEs for a given k_2 and k_3 . Accordingly, $k_{1,\text{UFAL,Pig}}$ was then set at 100,000 min⁻¹. The SSE was minimized by first using a grid search using SciPy's optimize brute function and subsequently refining the rate constants by using SciPy's optimize minimize function using the L-BFGS-B method. To solve for $k_{1,\text{UFAL},\text{Human}}$, we assume the following relationship

$$\frac{k_{1,\text{UFAL,Pig}}}{k_{1,\text{Humalog,Pig}}} = \frac{k_{1,\text{UFAL,Human}}}{k_{1,\text{Humalog,Human}}}$$

Values for $k_{1,\text{Humalog,Human}}$, $k_{2,\text{Human}}$, and $k_{3,\text{Human}}$ were used as reported in the literature (33).

Statistical analysis

All results are expressed as a mean ± SD unless specified otherwise. Figure 5 (D to I and K to M) is shown as means ± SEM. All statistical analyses were performed as general linear models in JMP Pro version 14. Comparisons between formulations (Fig. 5, D to I and K to M) were conducted using the restricted maximum likelihood repeated measures mixed model. Suitable transformations were applied as needed to meet the assumptions of the methods (homogeneity of variance, normality of error, and linearity). Time to 50% of peak up, time to peak, and time to 50% peak down were log-transformed for analyses to correct for nonhomogeneity of variance. Pig was included as a variable in the model as a random effect blocking (control) factor to account for variation in individual pig response. Statistical significance was considered as P < 0.05. For Fig. 5 (D to I), post hoc Bonferroni correction was applied to account for multiple comparisons, and significance was adjusted to $\alpha = 0.008$. Primary data are reported in data file S1.

SUPPLEMENTARY MATERIALS

stm.sciencemag.org/cgi/content/full/12/550/eaba6676/DC1 Materials and Methods

- Fig. S2. SEC traces of polymers from the initial copolymer library synthesis.
- Fig. S3. Aqueous SEC elution profile for commercial Humalog and UFAL formulations.
- Fig. S4. SEC traces of copolymers from the second screen targeting DP50.
- Fig. S5. In vitro and in vivo formulation bioactivity.
- Fig. S6. Cytotoxicity of leading AC/DC excipient MORPH-NIP_{23%} using NIH/3T3 cells. Fig. S7. Biocompatibility in diabetic rats.
- Fig. S8. Blood glucose of monomeric insulin in diabetic pigs.
- Fig. S9. AUMC/AUC for UFAL and Humalog in diabetic pigs.

Fig. S10. Pharmacokinetic outputs from model fitting compared to experimental pharmacokinetic data for Humalog and UFAL in diabetic pigs.

Table S1. Demonstration of work to validate SEC wt % measurement.

Table S2. SEC and MALS characterization and analysis of polymers synthesized in initial AC/DC library.

Table S3. Days until aggregation for recombinant insulin formulated with AC/DC excipients at two excipient concentrations (1 and 10 mg/ml).

Table S4. SEC and ¹H NMR analysis of polymers synthesized during the second screen targeting DP50.

Table S5. Days until aggregation for UFAL formulated with AC/DC excipients at 0.1 mg/ml. Table S6. Rate constants used for modeling PK curves in the manuscript.

Data file S1. Primary data.

Reference (51)

View/request a protocol for this paper from Bio-protocol.

REFERENCES AND NOTES

- A. Saad, C. Dalla Man, D. K. Nandy, J. A. Levine, A. E. Bharucha, R. A. Rizza, R. Basu, R. E. Carter, C. Cobelli, Y. C. Kudva, A. Basu, Diurnal pattern to insulin secretion and insulin action in healthy individuals. *Diabetes* **61**, 2691–2700 (2012).
- H. Tillil, E. T. Shapiro, M. A. Miller, T. Karrison, B. H. Frank, J. A. Galloway, A. H. Rubenstein, K. S. Polonsky, Dose-dependent effects of oral and intravenous glucose on insulin secretion and clearance in normal humans. *Am. J. Physiol.* 254, E349–E357 (1988).
- K. S. Polonsky, B. D. Given, E. Van Cauter, Twenty-four-hour profiles and pulsatile patterns of insulin secretion in normal and obese subjects. J. Clin. Invest. 81, 442–448 (1988).
- R. A. Heptulla, L. M. Rodriguez, L. Bomgaars, M. W. Haymond, The role of amylin and glucagon in the dampening of glycemic excursions in children with type 1 diabetes. *Diabetes* 54, 1100–1107 (2005).
- T. Heise, E. Zijlstra, L. Nosek, T. Rikte, H. Haahr, Pharmacological properties of faster-acting insulin aspart vs insulin aspart in patients with type 1 diabetes receiving continuous subcutaneous insulin infusion: A randomized, double-blind, crossover trial. *Diabetes Obes. Metab.* 19, 208–215 (2017).
- P. Senior, I. Hramiak, Fast-acting insulin aspart and the need for new mealtime insulin analogues in adults with type 1 and type 2 diabetes: A Canadian perspective. *Can. J. Diabetes* 43, 515–523 (2019).
- 7. F. Holleman, J. B. Hoekstra, Insulin lispro. N. Engl. J. Med. 337, 176–183 (1997).
- K. Gast, A. Schüler, M. Wolff, A. Thalhammer, H. Berchtold, N. Nagel, G. Lenherr, G. Hauck, R. Seckler, Rapid-acting and human insulins: Hexamer dissociation kinetics upon dilution of the pharmaceutical formulation. *Pharm. Res.* 34, 2270–2286 (2017).
- C. Mathieu, P. Gillard, K. Benhalima, Insulin analogues in type 1 diabetes mellitus: Getting better all the time. *Nat. Rev. Endocrinol.* 13, 385–399 (2017).
- V. Gingras, N. Taleb, A. Roy-Fleming, L. Legault, R. Rabasa-Lhoret, The challenges of achieving postprandial glucose control using closed-loop systems in patients with type 1 diabetes. *Diabetes Obes. Metab.* 20, 245–256 (2018).
- 11. E. Cengiz, Undeniable need for ultrafast-acting insulin: The pediatric perspective. J. Diabetes Sci. Technol. 6, 797–801 (2012).
- Q.-X. Hua, M. A. Weiss, Mechanism of insulin fibrillation: The structure of insulin under amyloidogenic conditions resembles a protein-folding intermediate. *J. Biol. Chem.* 279, 21449–21460 (2004).
- R. J. Woods, J. Alarcón, E. McVey, R. J. Pettis, Intrinsic fibrillation of fast-acting insulin analogs. J. Diabetes Sci. Technol. 6, 265–276 (2012).
- Y. Xu, Y. Yan, D. Seeman, L. Sun, P. L. Dubin, Multimerization and aggregation of native-state insulin: Effect of zinc. *Langmuir* 28, 579–586 (2012).
- U. Derewenda, Z. Derewenda, E. J. Dodson, G. G. Dodson, C. D. Reynolds, G. D. Smith, C. Sparks, D. Swenson, Phenol stabilizes more helix in a new symmetrical zinc insulin hexamer. *Nature* **338**, 594–596 (1989).
- 16. M. A. Weiss, in Vitamins & Hormones (Academic Press, 2009), vol. 80, pp. 33-49.
- V. Sluzky, J. A. Tamada, A. M. Klibanov, R. Langer, Kinetics of insulin aggregation in aqueous solutions upon agitation in the presence of hydrophobic surfaces. *Proc. Natl. Acad. Sci. U.S.A.* 88, 9377–9381 (1991).
- V. Sluzky, A. M. Klibanov, R. Langer, Mechanism of insulin aggregation and stabilization in agitated aqueous solutions. *Biotechnol. Bioeng.* 40, 895–903 (1992).

- L. Nault, P. Guo, B. Jain, Y. Bréchet, F. Bruckert, M. Weidenhaupt, Human insulin adsorption kinetics, conformational changes and amyloidal aggregate formation on hydrophobic surfaces. *Acta Biomater.* 9, 5070–5079 (2013).
- M. Muzaffar, A. Ahmad, The mechanism of enhanced insulin amyloid fibril formation by NaCl is better explained by a conformational change model. *PLOS ONE* 6, e27906 (2011).
- M. J. Webber, E. A. Appel, B. Vinciguerra, A. B. Cortinas, L. S. Thapa, S. Jhunjhunwala, L. Isaacs, R. Langer, D. G. Anderson, Supramolecular PEGylation of biopharmaceuticals. *Proc. Natl. Acad. Sci. U.S.A.* 113, 14189–14194 (2016).
- 22. C. Yang, D. Lu, Z. Liu, How PEGylation enhances the stability and potency of insulin: A molecular dynamics simulation. *Biochemistry* **50**, 2585–2593 (2011).
- Y. Liu, J. Lee, K. M. Mansfield, J. H. Ko, S. Sallam, C. Wesdemiotis, H. D. Maynard, Trehalose glycopolymer enhances both solution stability and pharmacokinetics of a therapeutic protein. *Bioconjug. Chem.* 28, 836–845 (2017).
- C. L. Maikawa, A. A. A. Smith, L. Zou, C. M. Meis, J. L. Mann, M. J. Webber, E. A. Appel, Stable monomeric insulin formulations enabled by supramolecular PEGylation of insulin analogues. *Adv. Ther.* 3, 1900094 (2020).
- N. Bertrand, J.-C. Leroux, The journey of a drug-carrier in the body: An anatomo-physiological perspective. J. Control. Release 161, 152–163 (2012).
- J. M. Ting, S. Tale, A. A. Purchel, S. D. Jones, L. Widanapathirana, Z. P. Tolstyka, L. Guo, S. J. Guillaudeu, F. S. Bates, T. M. Reineke, High-throughput excipient discovery enables oral delivery of poorly soluble pharmaceuticals. ACS Cent. Sci. 2, 748–755 (2016).
- 27. Amended final report on the safety assessment of polyacrylamide and acrylamide residues in cosmetics. *Int. J. Toxicol.* **24**, 21–50 (2005).
- S. M. Patil, D. A. Keire, K. Chen, Comparison of NMR and dynamic light scattering for measuring diffusion coefficients of formulated insulin: Implications for particle size distribution measurements in drug products. *AAPS J.* **19**, 1760–1766 (2017).
- G. Andersen, G. Meiffren, D. Lamers, J. H. DeVries, A. Ranson, C. Seroussi, B. Alluis, M. Gaudier, O. Soula, T. Heise, Ultra-rapid BioChaperone lispro improves postprandial blood glucose excursions vs insulin lispro in a 14-day crossover treatment study in people with type 1 diabetes. *Diabetes Obes. Metab.* **20**, 2627–2632 (2018).
- J. Plank, A. Wutte, G. Brunner, A. Siebenhofer, B. Semlitsch, R. Sommer, S. Hirschberger, T. R. Pieber, A direct comparison of insulin aspart and insulin lispro in patients with type 1 diabetes. *Diabetes Care* 25, 2053–2057 (2002).
- T. Heise, U. Hövelmann, L. Brøndsted, C. L. Adrian, L. Nosek, H. Haahr, Faster-acting insulin aspart: Earlier onset of appearance and greater early pharmacokinetic and pharmacodynamic effects than insulin aspart. *Diabetes Obes. Metab.* 17, 682–688 (2015).
- M. Fath, T. Danne, T. Biester, L. Erichsen, O. Kordonouri, H. Haahr, Faster-acting insulin aspart provides faster onset and greater early exposure vs insulin aspart in children and adolescents with type 1 diabetes mellitus. *Pediatr. Diabetes* 18, 903–910 (2017).
- J. Wong, J. G. Chase, C. E. Hann, G. M. Shaw, T. F. Lotz, J. Lin, A. J. Le Compte, A subcutaneous insulin pharmacokinetic model for computer simulation in a diabetes decision support role: Model structure and parameter identification. *J. Diabetes Sci. Technol.* 2, 658–671 (2008).
- R. J. Pettis, L. Hirsch, C. Kapitza, L. Nosek, U. Hövelmann, H.-J. Kurth, D. E. Sutter, N. G. Harvey, L. Heinemann, Microneedle-based intradermal versus subcutaneous administration of regular human insulin or insulin lispro: Pharmacokinetics and postprandial glycemic excursions in patients with type 1 diabetes. *Diabetes Technol. Ther.* 13, 443–450 (2011).
- K. Rave, O. Klein, A. D. Frick, R. H. A. Becker, Advantage of premeal-injected insulin glulisine compared with regular human insulin in subjects with type 1 diabetes. *Diabetes Care* 29, 1812–1817 (2006).
- T. Heise, G. Meiffren, B. Alluis, C. Seroussi, A. Ranson, J. Arrubla, J. Correia, M. Gaudier, O. Soula, R. Soula, J. H. DeVries, O. Klein, B. Bode, BioChaperone Lispro versus faster aspart and insulin aspart in patients with type 1 diabetes using continuous subcutaneous insulin infusion: A randomized euglycemic clamp study. *Diabetes Obes. Metab.* 21, 1066–1070 (2019).
- A. Lindholm, J. McEwen, A. P. Riis, Improved postprandial glycemic control with insulin aspart. A randomized double-blind cross-over trial in type 1 diabetes. *Diabetes Care* 22, 801–805 (1999).
- R. H. A. Becker, A. D. Frick, Clinical pharmacokinetics and pharmacodynamics of insulin glulisine. *Clin. Pharmacokinet.* 47, 7–20 (2008).
- A. Kavitha, A. Parambath, in *Engineering of Biomaterials for Drug Delivery Systems*, A. Parambath, Ed. (Woodhead Publishing, 2018), pp. 229–253.
- M. Gorman, Y. H. Chim, A. Hart, M. O. Riehle, A. J. Urquhart, Poly(N-acryloylmorpholine): A simple hydrogel system for temporal and spatial control over cell adhesion. *J. Biomed. Mater. Res. B Appl. Biomater.* **102**, 1809–1815 (2014).

- D. Russell-Jones, B. W. Bode, C. De Block, E. Franek, S. R. Heller, C. Mathieu, A. Philis-Tsimikas, L. Rose, V. C. Woo, A. B. Østerskov, T. Graungaard, R. M. Bergenstal, Fast-acting insulin aspart improves glycemic control in basal-bolus treatment for type 1 diabetes: Results of a 26-week multicenter, active-controlled, treat-to-target, randomized, parallel-groups trial (onset 1). *Diabetes Care* **40**, 943–950 (2017).
- L. Leelarathna, D. Ashley, C. Fidler, W. Parekh, The value of fast-acting insulin aspart compared with insulin aspart for patients with diabetes mellitus treated with bolus insulin from a UK health care system perspective. *Ther. Adv. Endocrinol. Metab.* 9, 187–197 (2018).
- 43. H. Haahr, T. R. Pieber, C. Mathieu, T. Gondolf, M. Shiramoto, L. Erichsen, T. Heise, Clinical pharmacology of fast-acting insulin aspart versus insulin aspart measured as free or total insulin aspart and the relation to anti-insulin aspart antibody levels in subjects with type 1 diabetes mellitus. *Clin. Pharmacokinet.* **58**, 639–649 (2019).
- L. Heinemann, R. Baughman, A. Boss, M. Hompesch, Pharmacokinetic and pharmacodynamic properties of a novel inhaled insulin. *J. Diabetes Sci. Technol.* 11, 148–156 (2017).
- M. O. Larsen, B. Rolin, Use of the Göttingen minipig as a model of diabetes, with special focus on type 1 diabetes research. *ILAR J.* 45, 303–313 (2004).
- 46. J. M. Radziuk, J. C. Davies, W. S. Pye, J. E. Shields, R. D. DiMarchi, R. E. Chance, Bioavailability and bioeffectiveness of subcutaneous human insulin and two of its analogs—Lys^{B28}Pro^{B29}-human insulin and Asp^{B10}Lys^{B28}Pro^{B29}-human insulin—Assessed in a conscious pig model. *Diabetes* **46**, 548–556 (1997).
- J. Kildegaard, S. T. Buckley, R. H. Nielsen, G. K. Povlsen, T. Seested, U. Ribel, H. B. Olsen, S. Ludvigsen, C. B. Jeppesen, H. H. F. Refsgaard, K. M. Bendtsen, N. R. Kristensen, S. Hostrup, J. Sturis, Elucidating the mechanism of absorption of fast-acting insulin aspart: The role of niacinamide. *Pharm. Res.* **36**, 49 (2019).
- M. Chen, G. Moad, E. Rizzardo, Thiocarbonylthio end group removal from RAFT-synthesized polymers by a radical-induced process. *J. Polym. Sci. A Polym. Chem.* 47, 6704–6714 (2009).
- C. P. Jesson, C. M. Pearce, H. Simon, A. Werner, V. J. Cunningham, J. R. Lovett, M. J. Smallridge, N. J. Warren, S. P. Armes, H₂O₂ enables convenient removal of RAFT end-groups from block copolymer nano-objects prepared via polymerization-induced self-assembly in water. *Macromolecules* **50**, 182–191 (2017).
- 50. G. Berthon, Handbook of Metal-Ligand Interactions in Biological Fluids (Marcel Dekker, 1995).
- K. K. Wu, Y. Huan, Streptozotocin-induced diabetic models in mice and rats. *Curr. Protoc. Pharmacol.* 40, 5.47.1–5.47.14 (2008).

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An ultrafast insulin formulation enabled by high-throughput screening of engineered polymeric excipients

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Faster formulations

People with type 1 diabetes require exogenous insulin to regulate blood glucose, but controlling glycemic excursions at mealtimes is difficult using current insulin formulations. Mann *et al.* developed polymeric excipients to reduce insulin aggregation and improve pharmacokinetics. When formulated with insulin lispro, the top-performing acrylamide carrier/dopant copolymer excipient enabled fast insulin absorption upon subcutaneous delivery in diabetic pigs and improved stability in response to stressed aging conditions as compared to commercial fast-acting insulin lispro. This rapidly absorbed insulin formulation could improve glucose control for diabetes.

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