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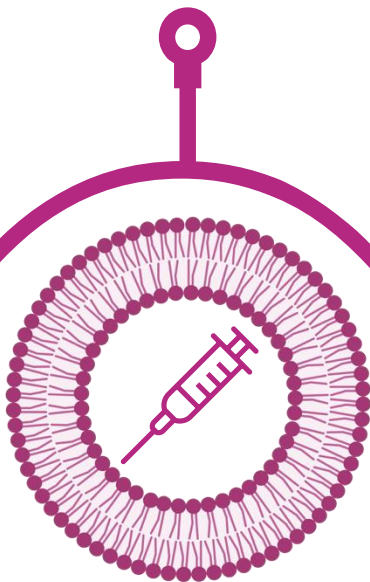
Thudichum award lecture

From computational design of responsive liposomal depots to predictive microfluidic manufacturing

Presented by Remo Eugster, PhD

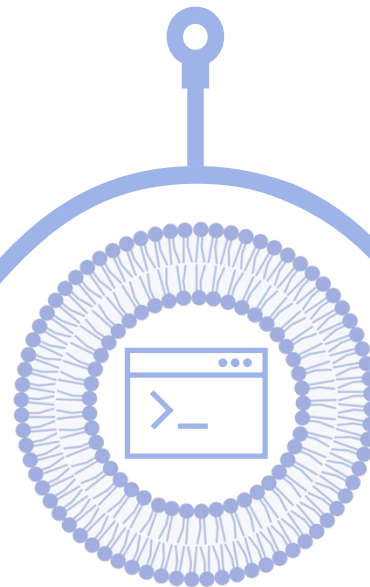
Computational design

Physiologically controlled release from an in situ forming liposomal depot



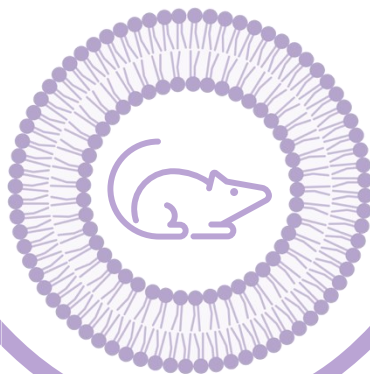
Predictive manufacturing

Streamlining the development of liposomal drug delivery systems



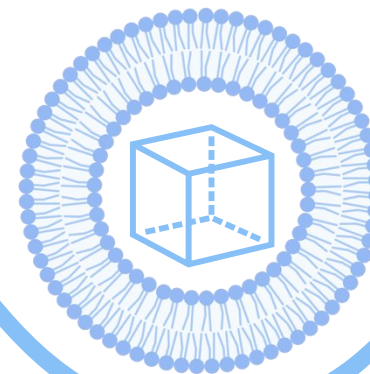
New alternative methods

Replace, refine and reduce animal testing



Advanced delivery

Developing composite drug delivery systems

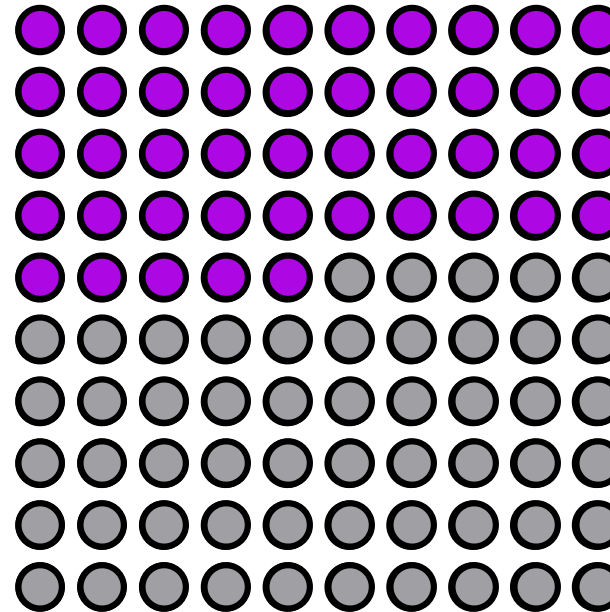


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The silent epidemic



Poor treatment adherence continues to compromise outcomes across human and veterinary medicine. Today's treatments are frequent, invasive and inconvenient



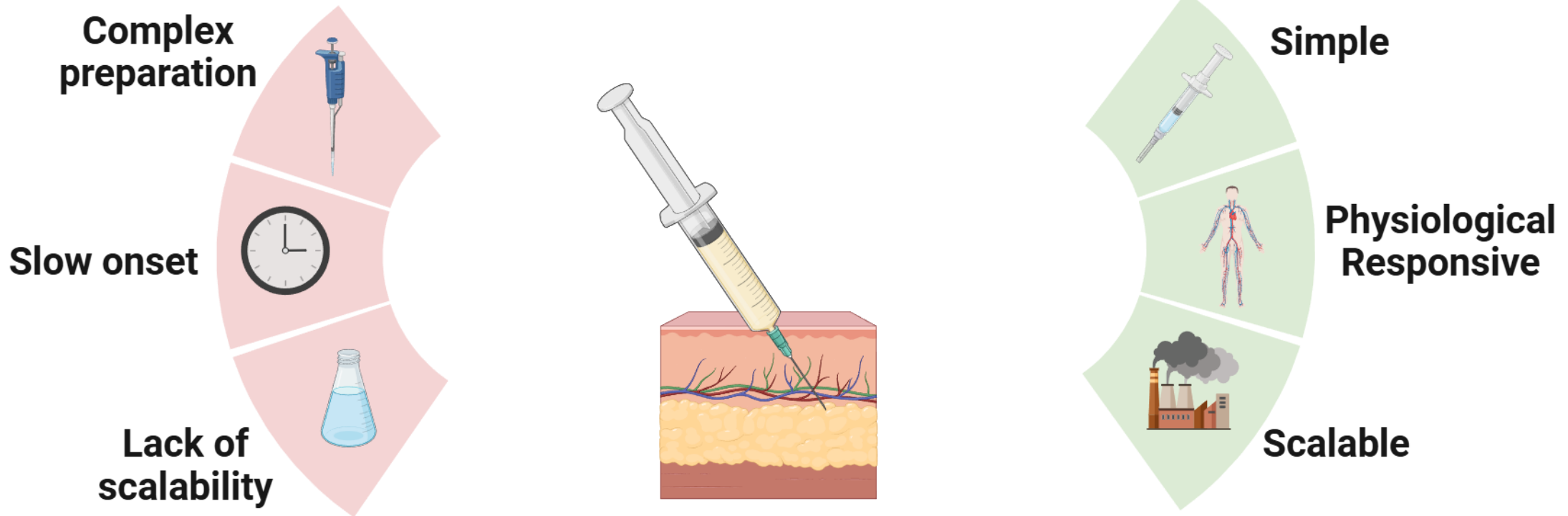
 Poor Treatment Adherence

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The opportunity in prolonged-acting injectables



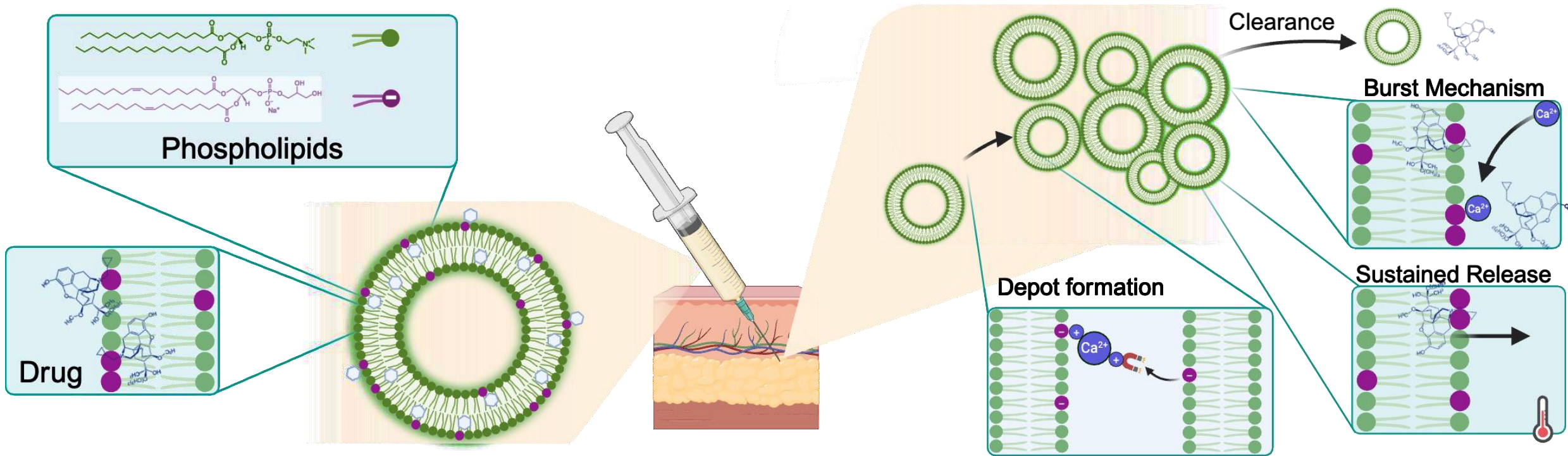
Leverage subcutaneous (s.c.) space for depot formulations and overcome current barriers



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Solving delivery challenges: TILD

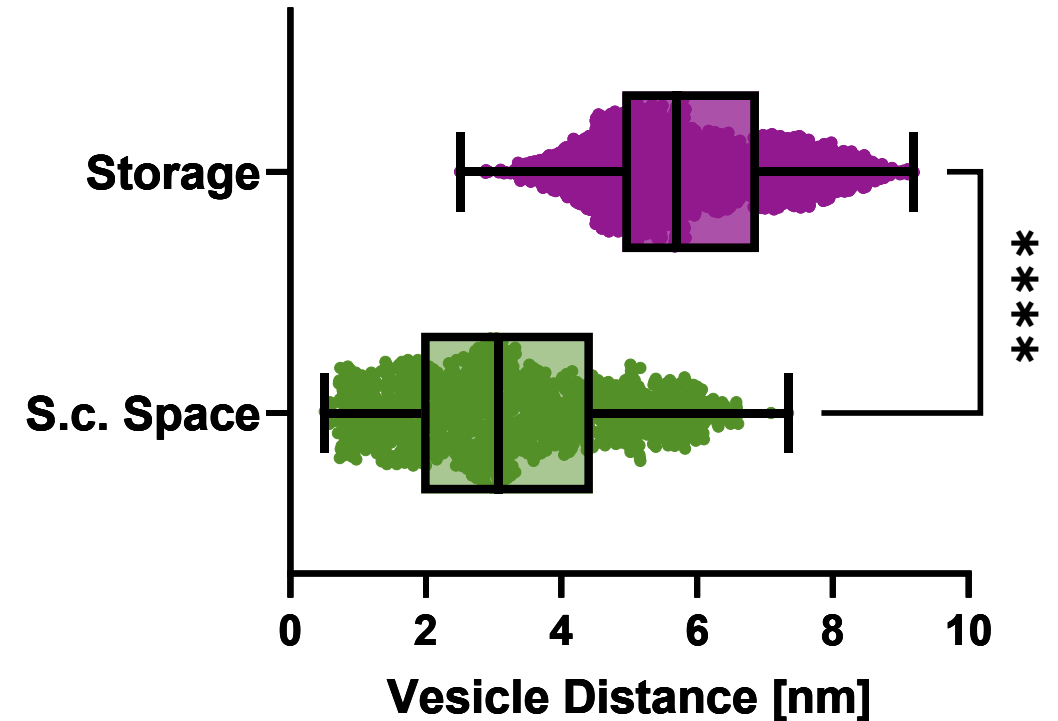
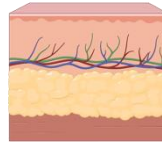
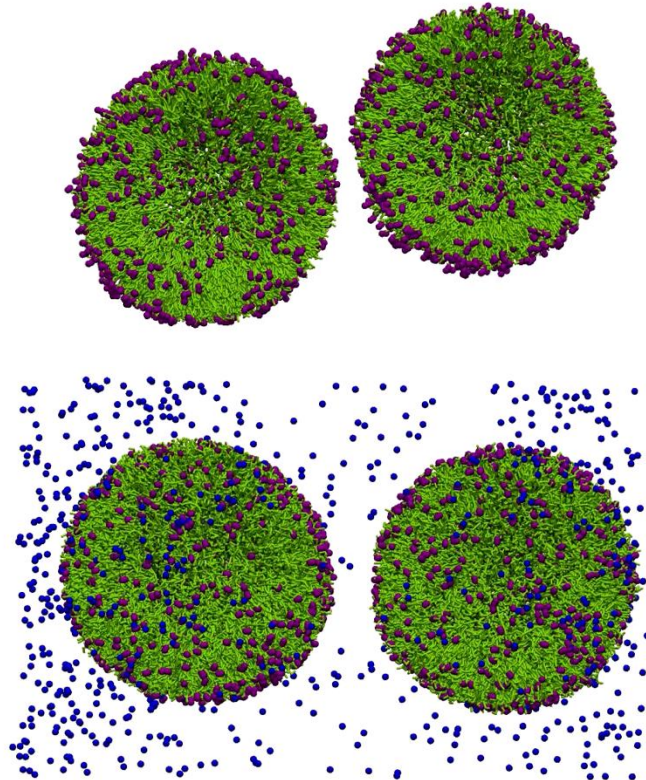
Thermoresponsive in-situ forming **Liposomal Depot** (TILD) with dual-phase drug release



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Mechanistic Computational Design

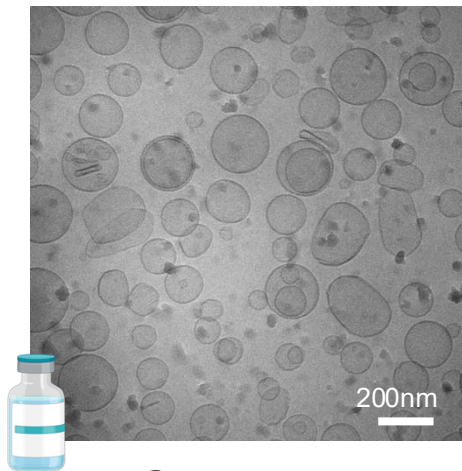
Computational design and simulation of s.c. space guide and validate drug lipid interactions and depot formation induced by subcutaneous cations



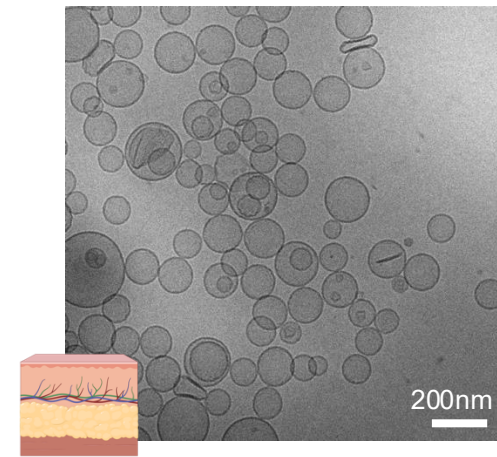
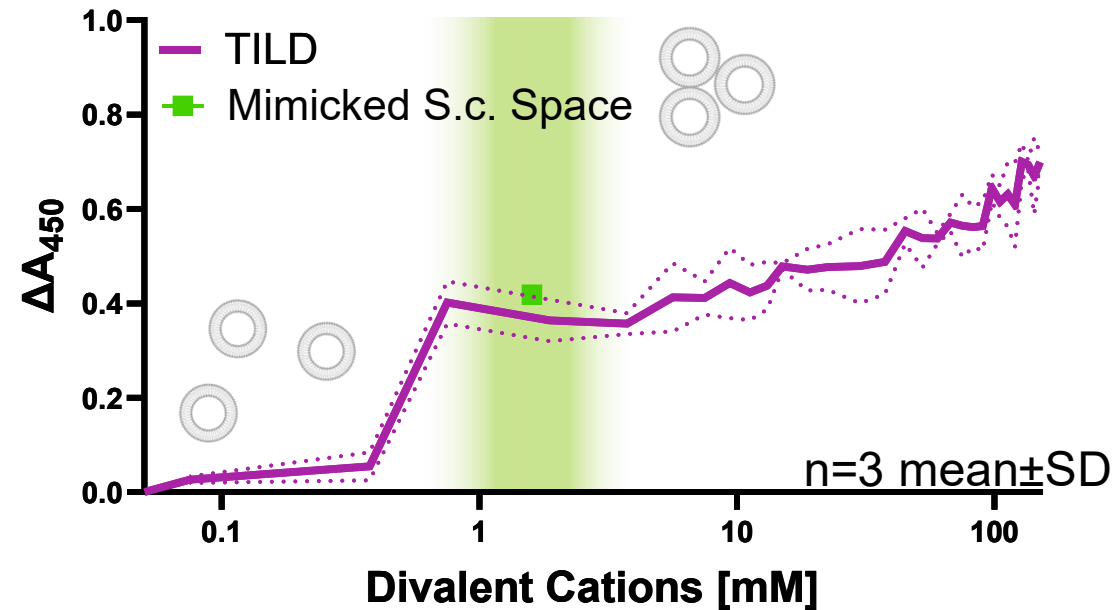
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Experimental Validation: Depot formation

In-situ forming depot by aggregating liposomes while maintaining their integrity



Storage

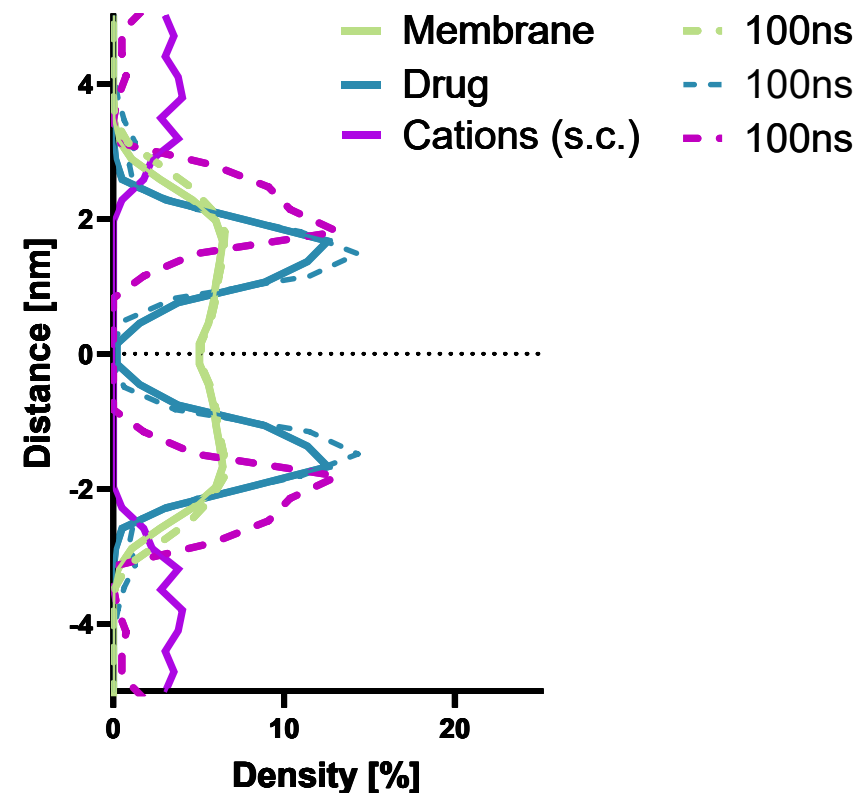
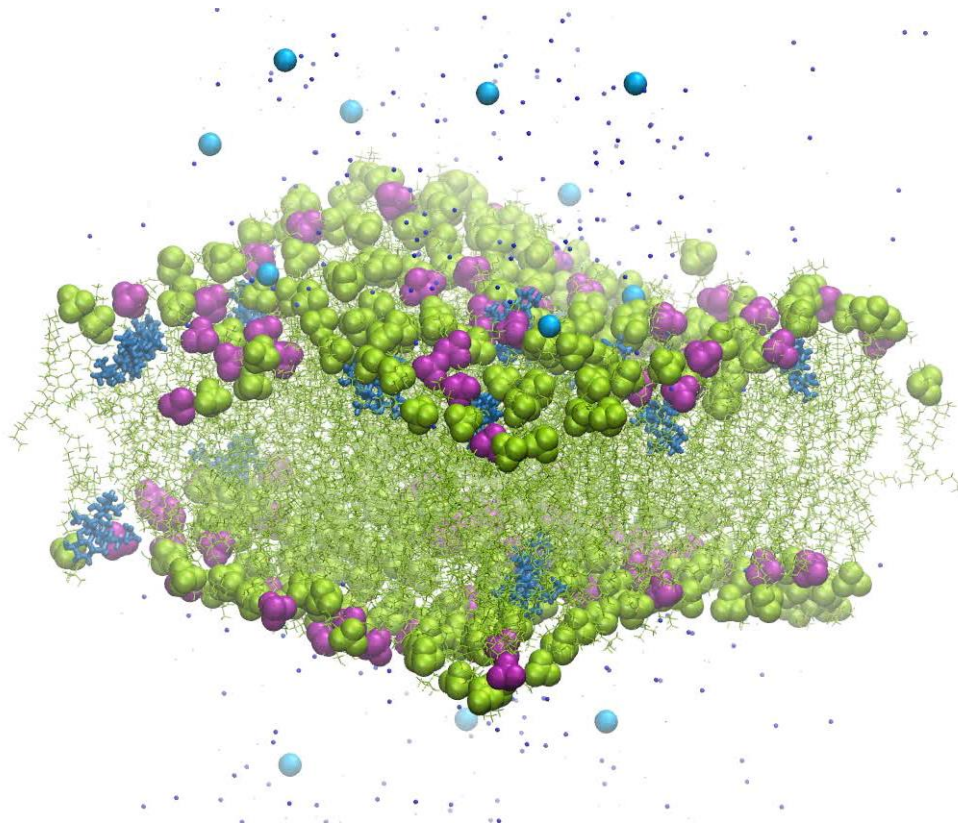


S.c. Space

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Mechanistic Computational Design

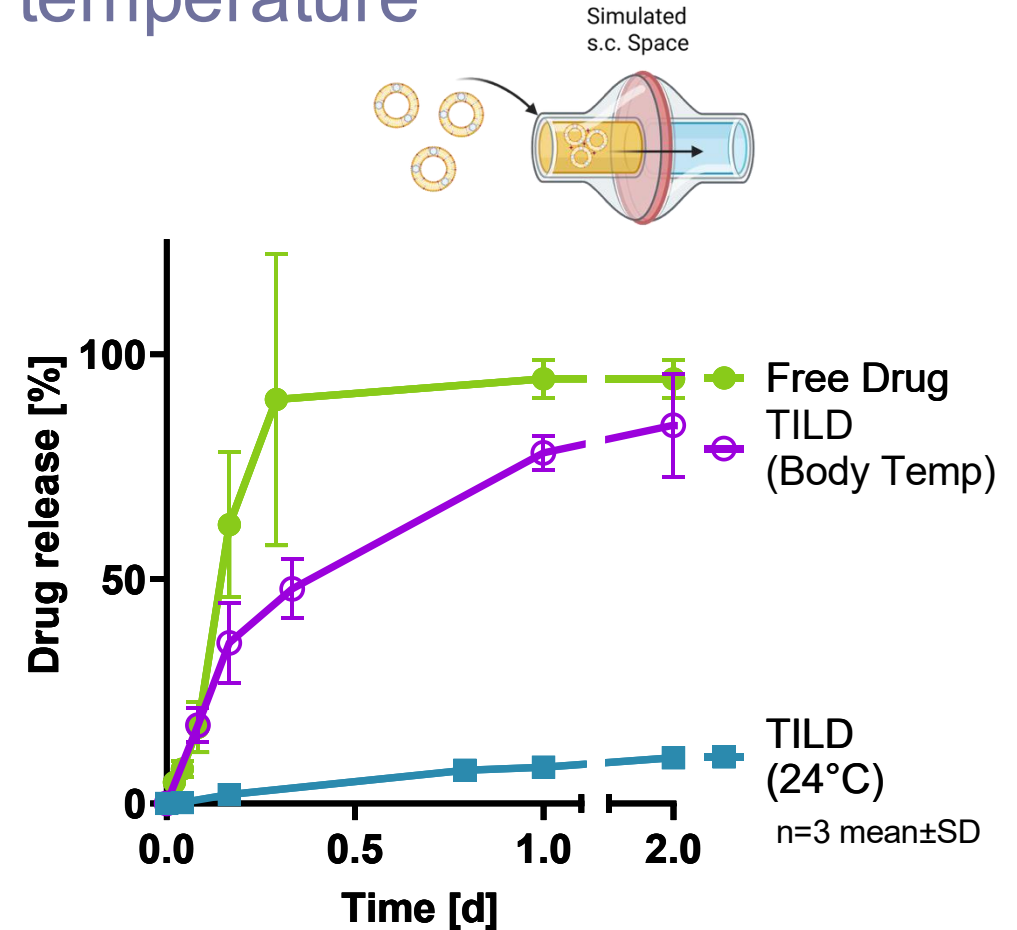
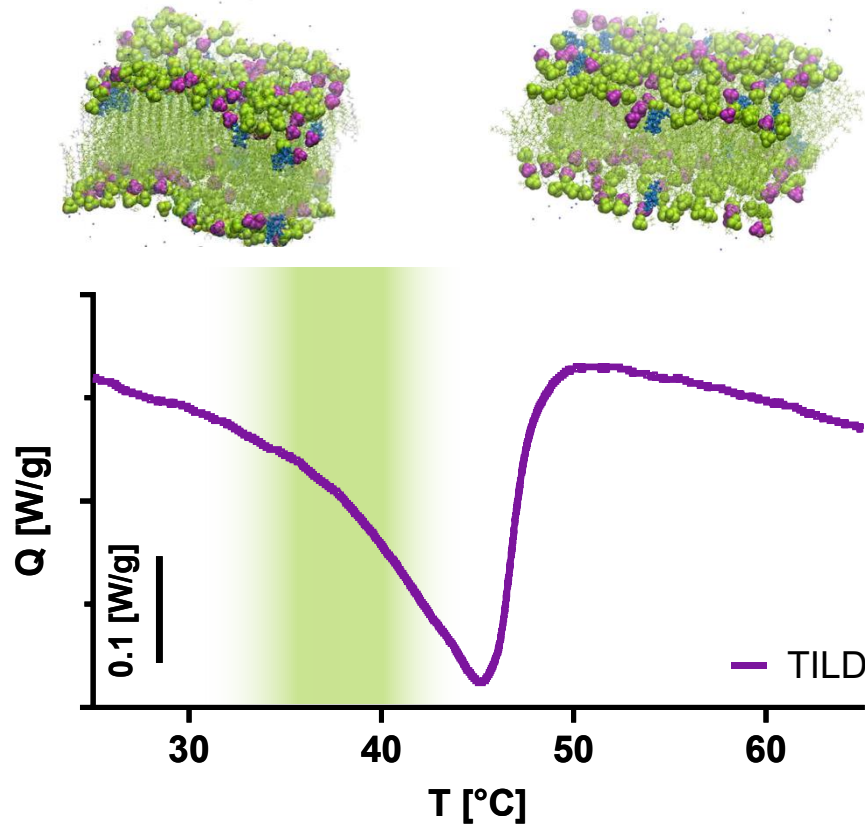
Simulation of membrane system within modeled s.c. space
indicate drug release driven by physiological cations



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Experimental Validation: Temperature trigger

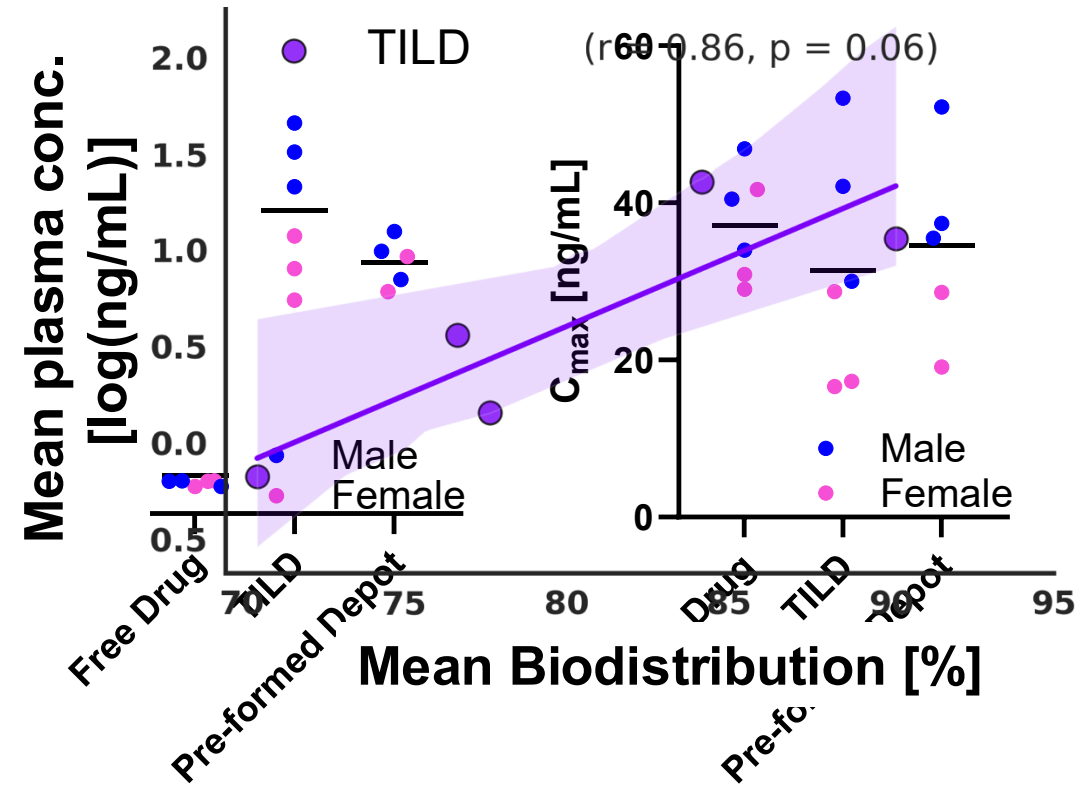
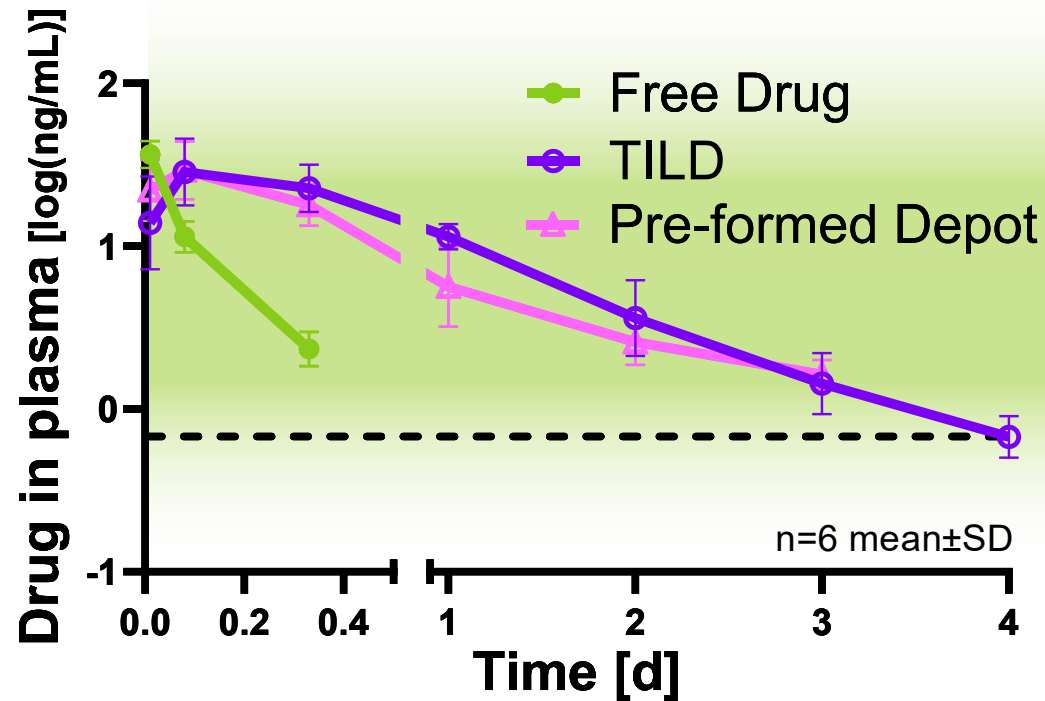
Sustained drug release driven by body temperature



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Proof of concept

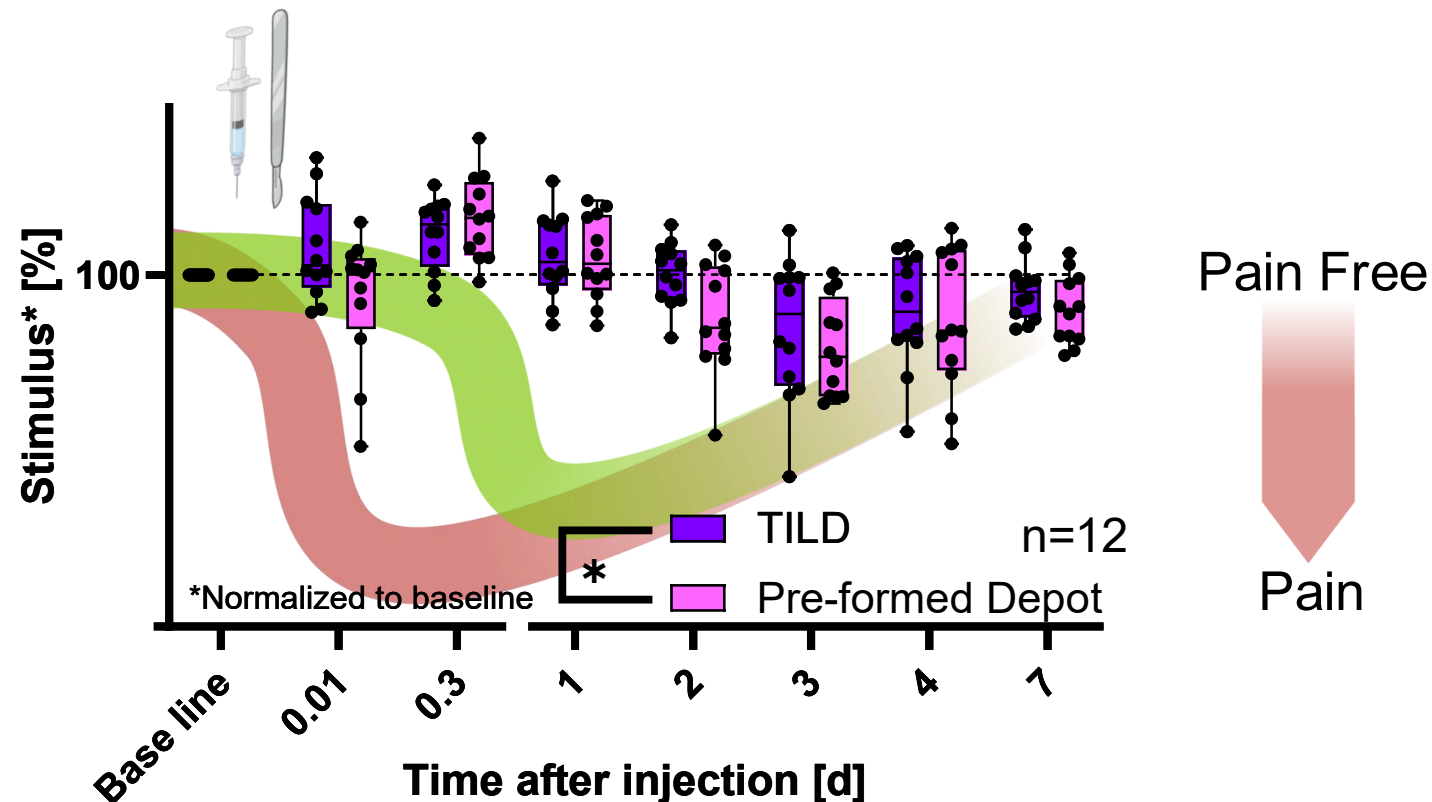
Pharmacokinetic studies demonstrate maintenance of therapeutic window for 3-4 days



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Therapeutic translation

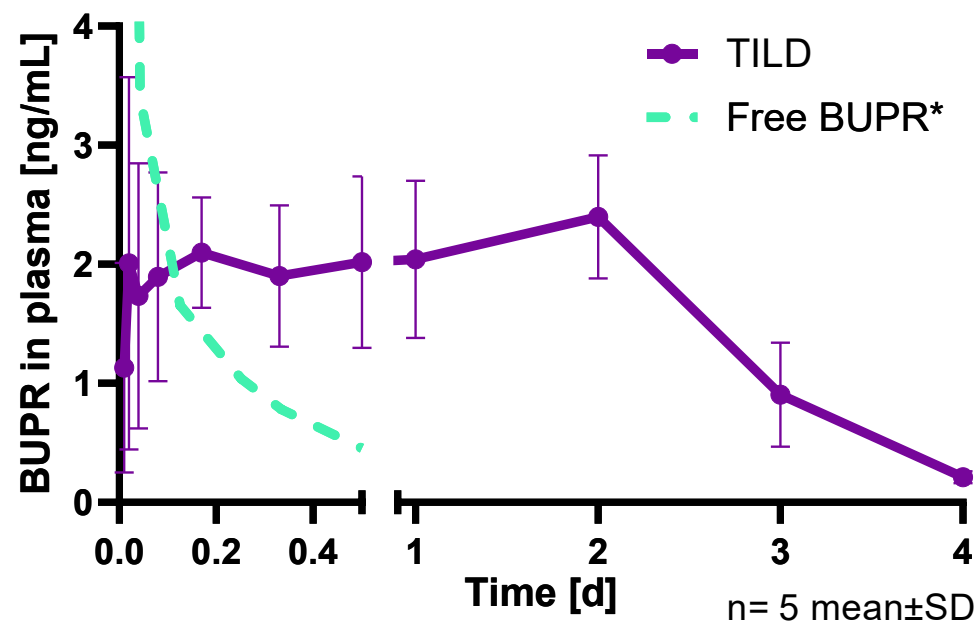
Surgical incision models in rats demonstrate pain relief over 3 days outperforming current options



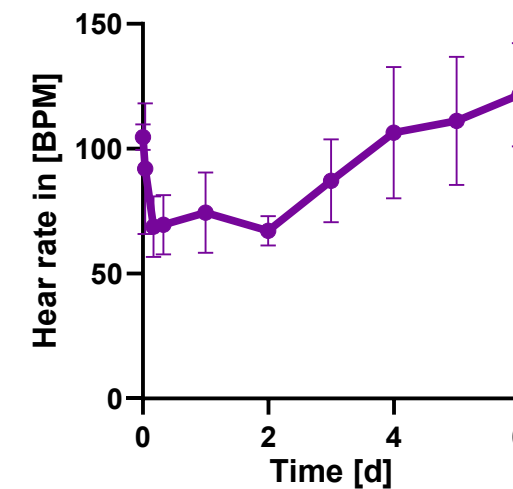
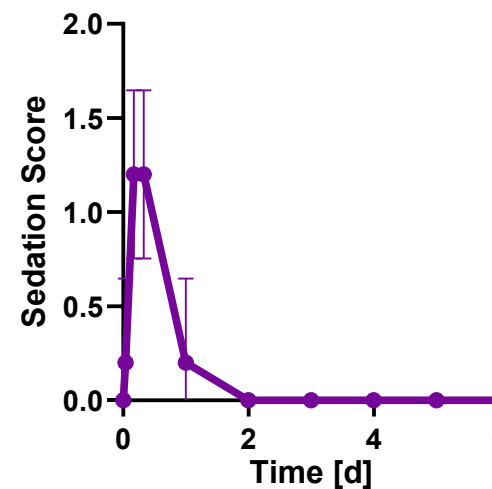
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Validation in dogs

Sustained therapeutic levels for up to 3 days while remaining tolerable and safe



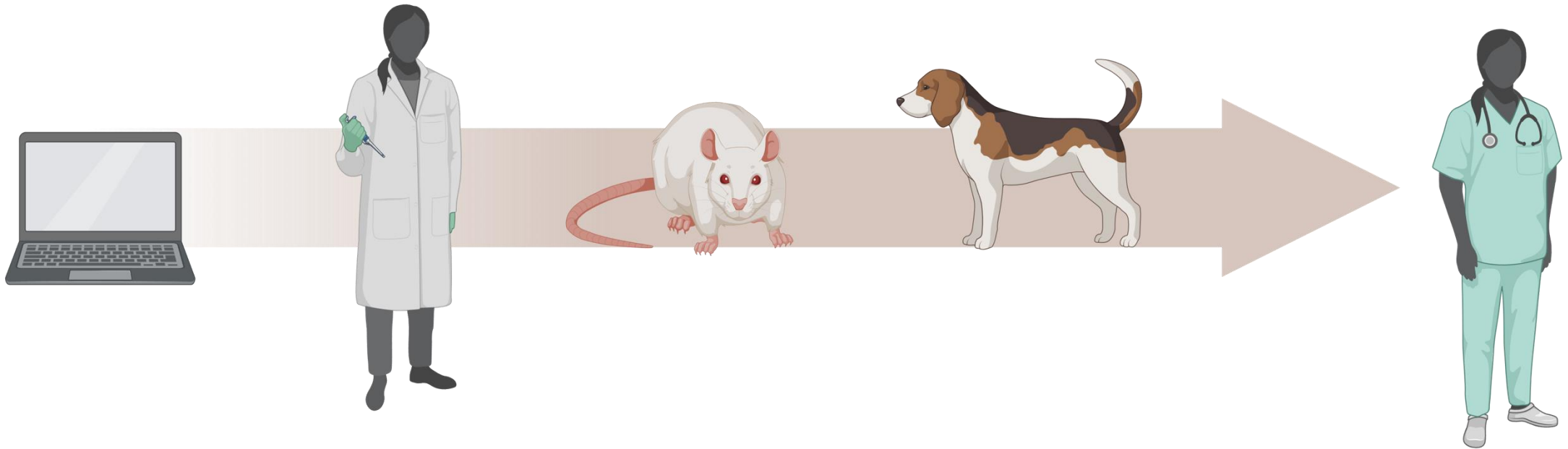
*Nunamaker et al. 2014



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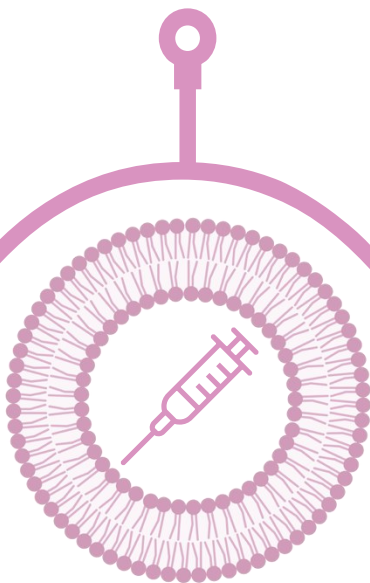
From screen to clinics

Strong alignment between design and outcome, successful translation from lab to different species - Next steps: Clinical Pilots



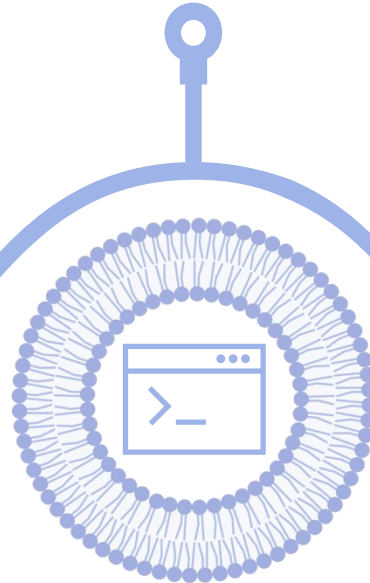
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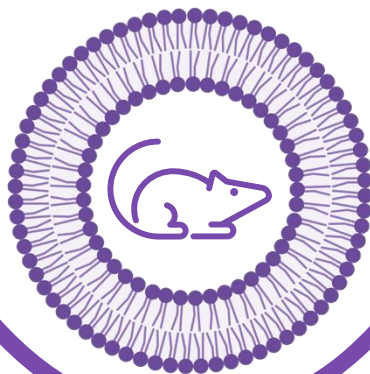
Predictive manufacturing

Streamlining the development of liposomal drug delivery systems



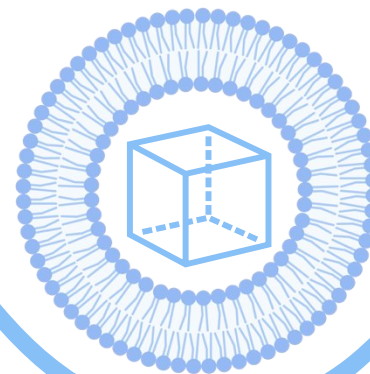
New alternative methods

Replace, refine and reduce animal testing



Advanced delivery

Developing composite drug delivery systems

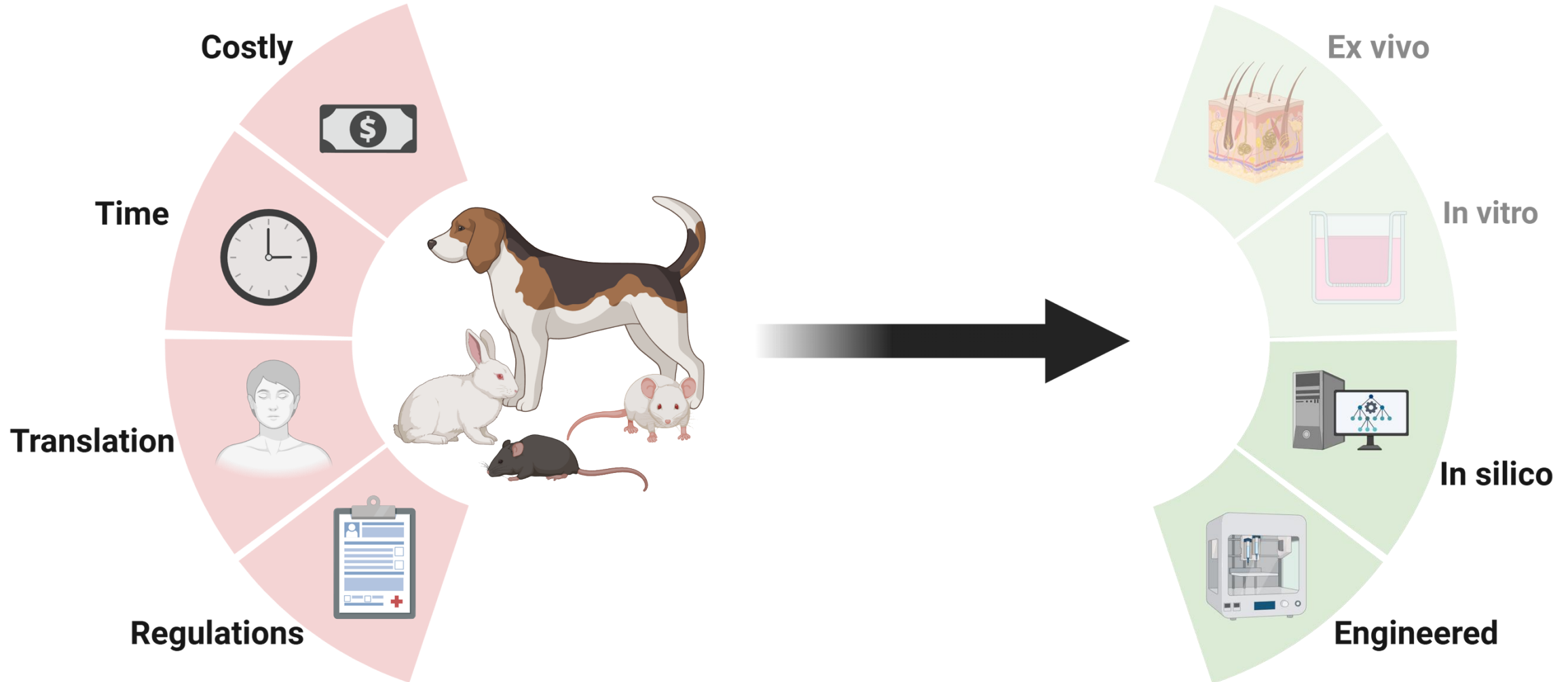


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New alternative methods for animal models



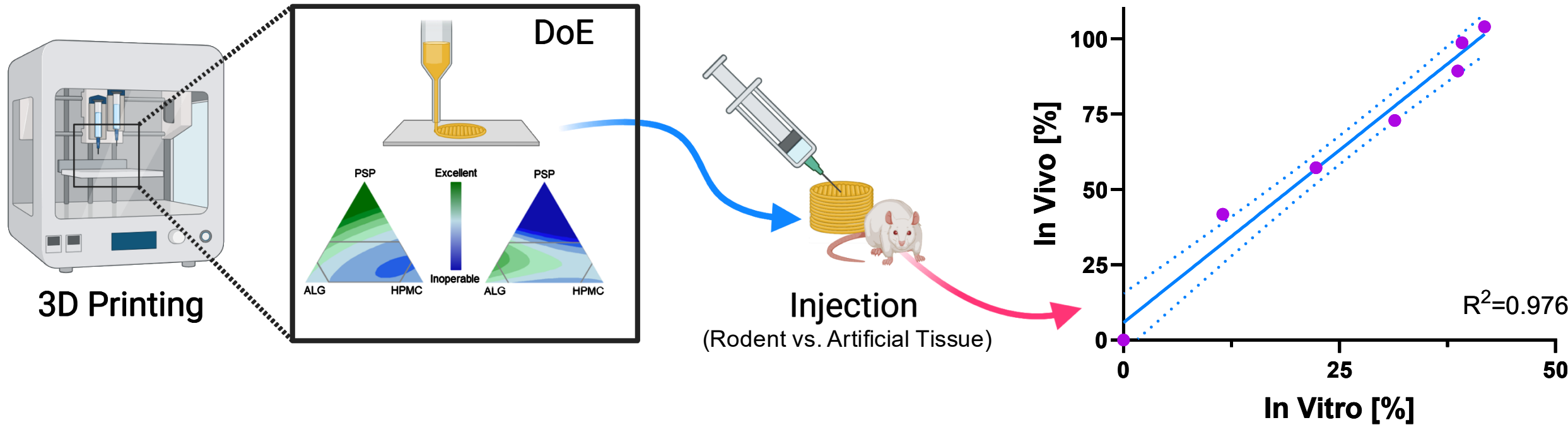
These methods together form an ethically aligned, more predictive, and more cost-effective alternative pipeline for evaluating s.c. formulations



u^b 3D-printed artificial s.c. tissue



Printed constructs reduce biological variability and can be stored, standardized, and reproduced on demand.

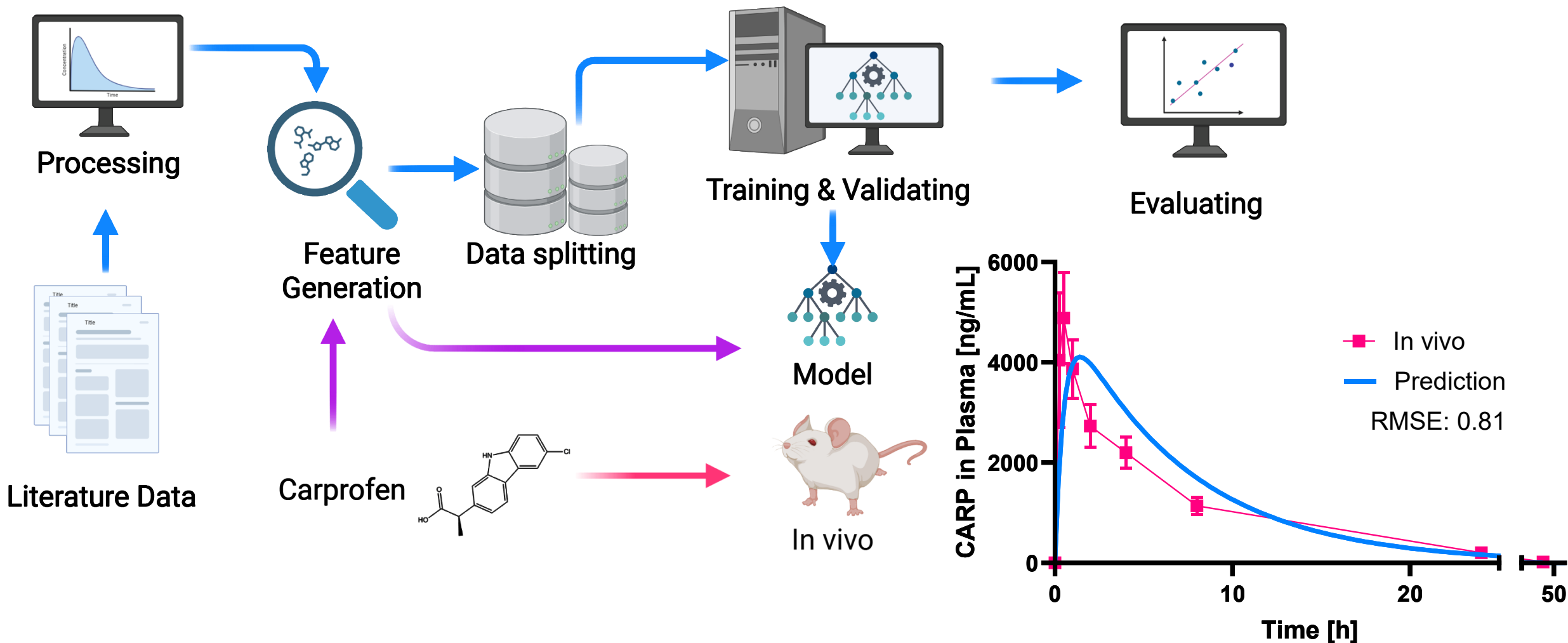


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Machine learning to predict s.c. pharmacokinetics



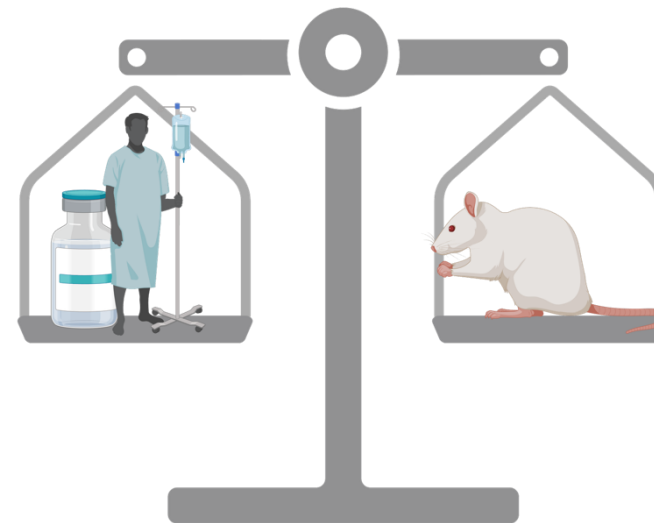
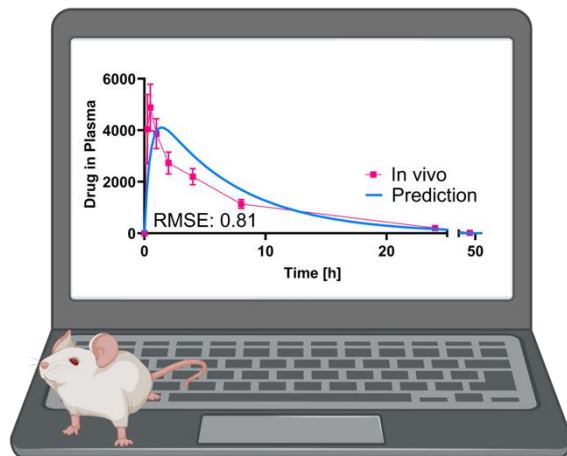
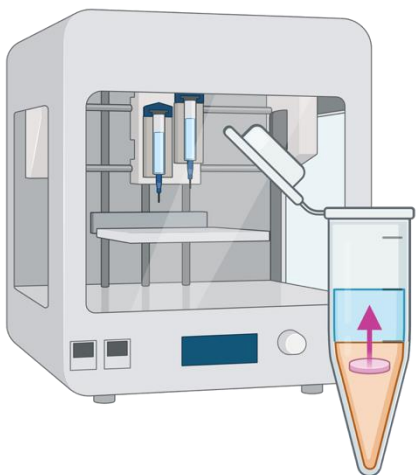
Models trained on curated rodent datasets predict V, Cl, and k_a , thereby reducing exploratory animal studies.



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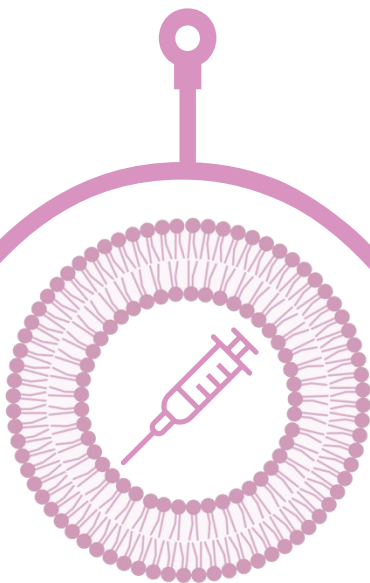
From flesh to digits

Together the models form an ethically aligned, more predictive pipeline for developing long-acting s.c. formulations.



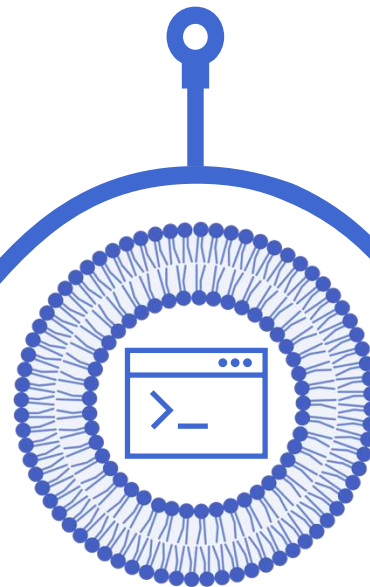
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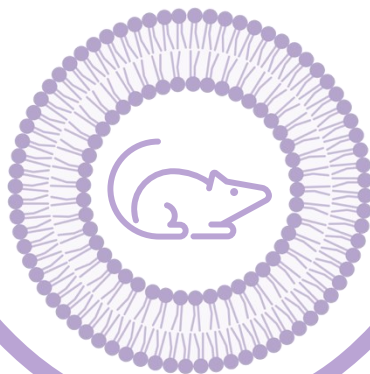
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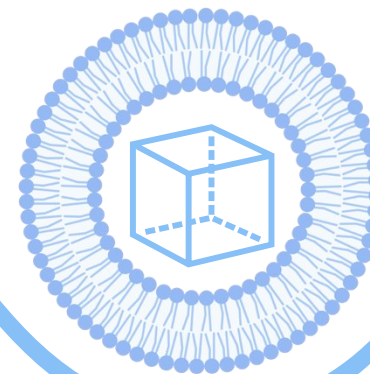
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Advanced delivery

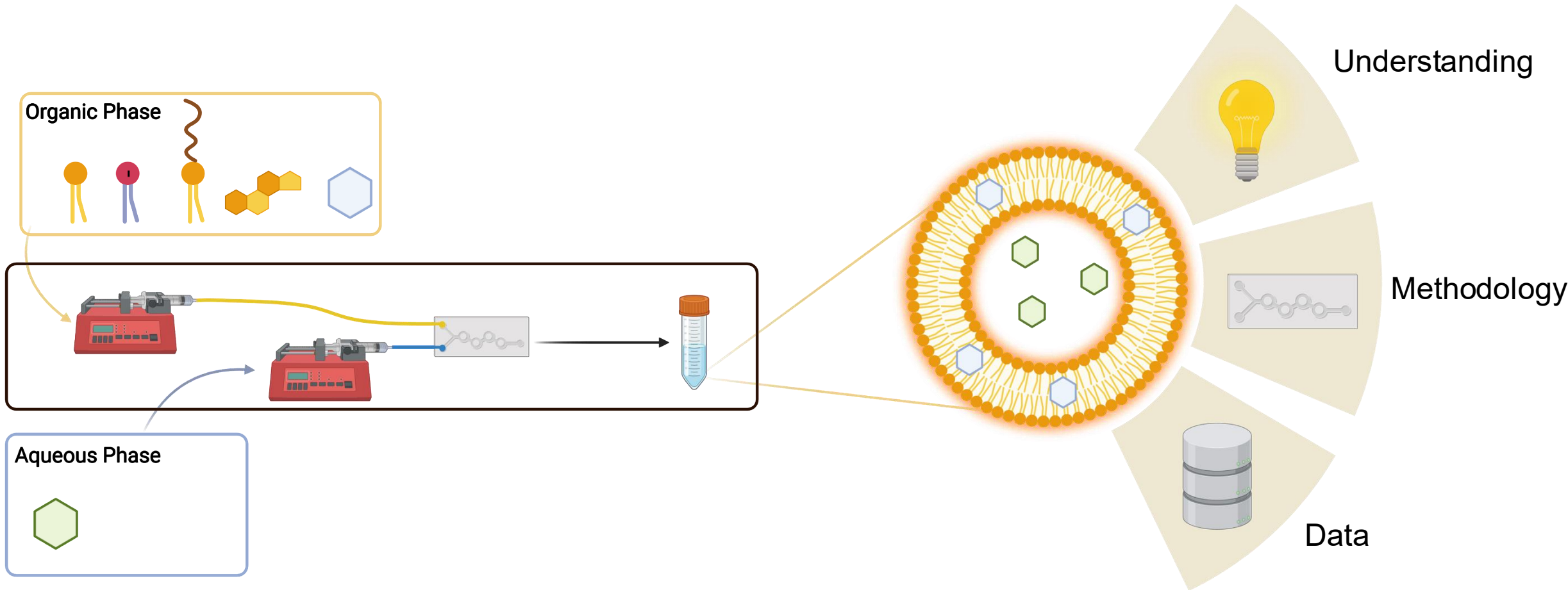
Developing composite drug delivery systems



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The bottleneck in liposome development

Microfluidic liposome production still relies on intuition, trial-and-error, and incomplete mechanistic understanding.



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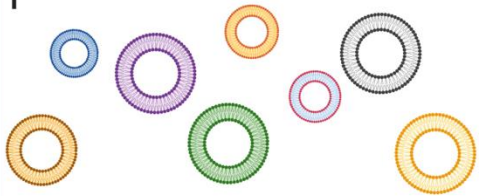
A data-driven path to predictable microfluidics



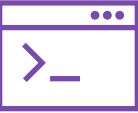
We built a harmonized dataset integrating formulation and process parameters to model liposome outcomes.

Machine Learning

Model validation

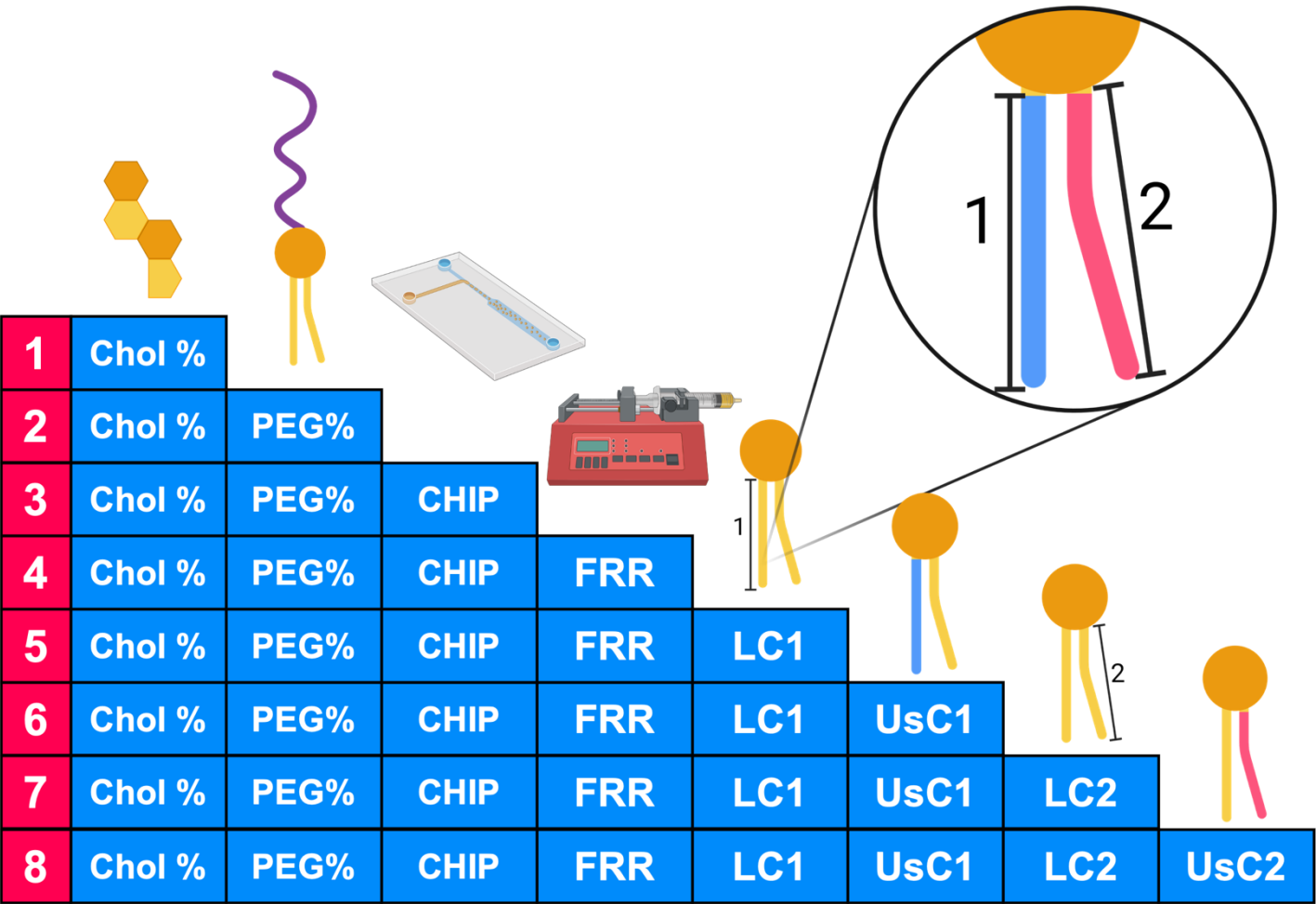


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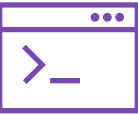


Feature selection

Identifying and selecting most relevant features in dataset, associated with microfluidic liposome production

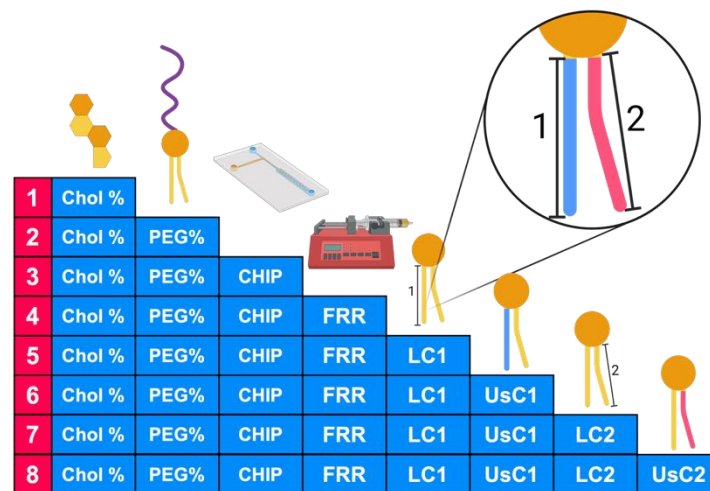
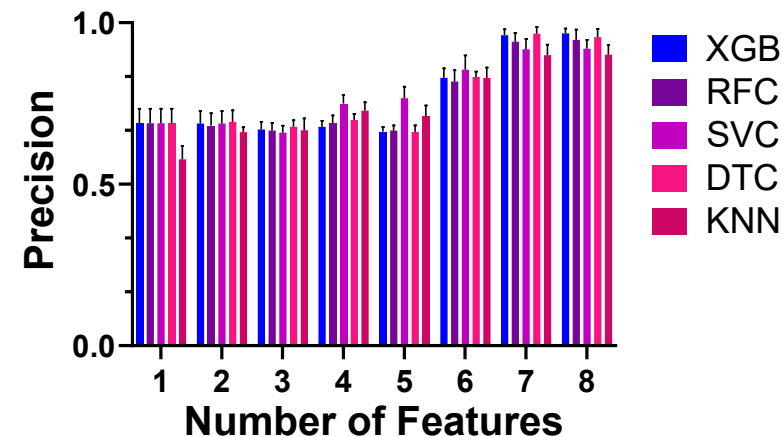
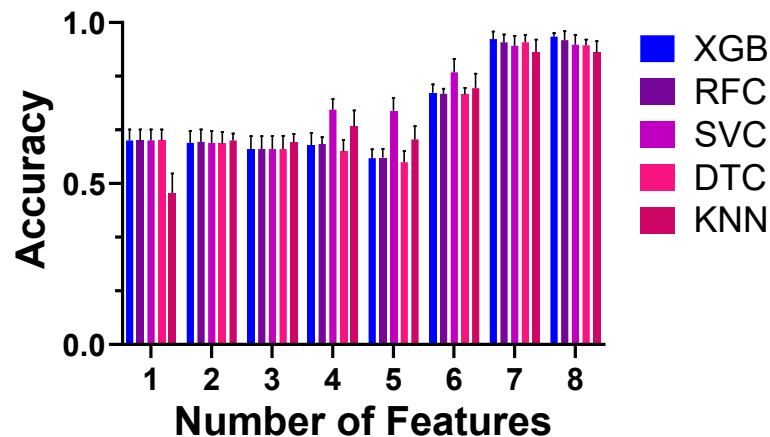


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Predicting formation of liposomes

Model after incremental feature addition - XGB performing best.



XGB: Extreme gradient boosting, RFC: Random forest classifier, SVC: Support vector classifier, DTC: Decision tree classifier, KNN: K-nearest neighbour

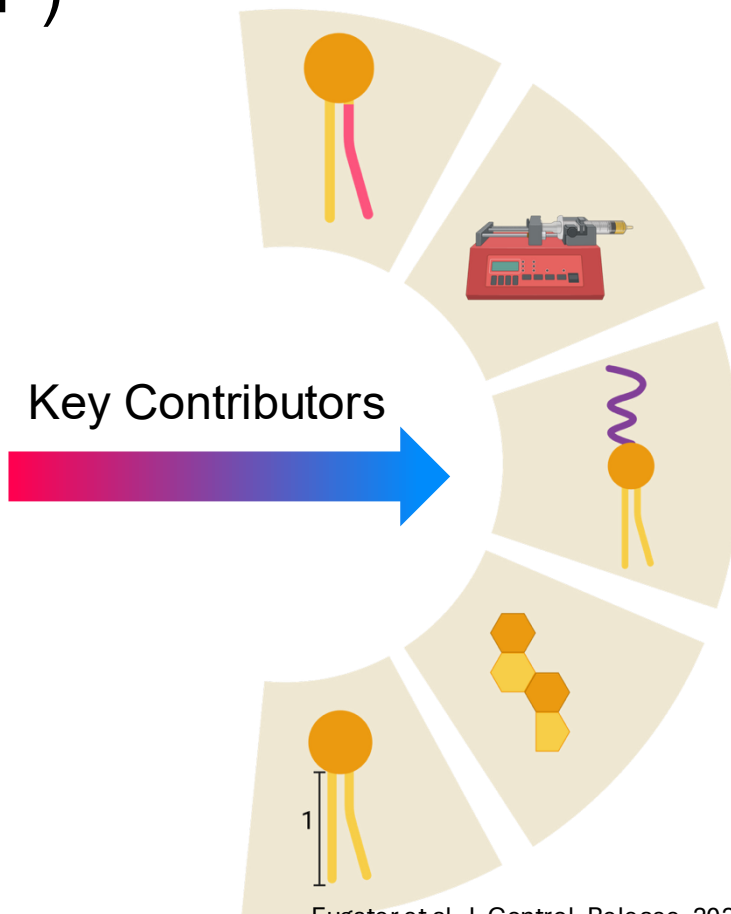
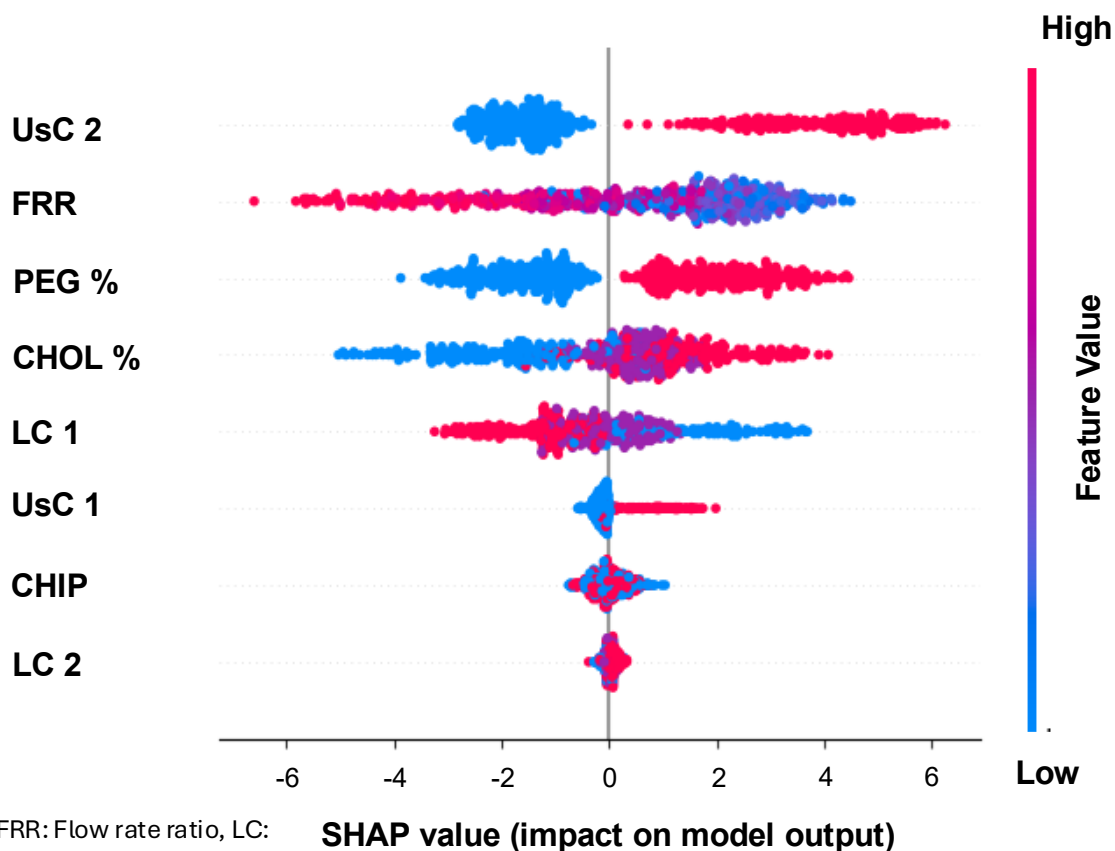
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Predicting formation of liposomes

Explainable AI, allows to extract information from black-box models and provide more transparency to the predictions



Shapley additive explanations (SHAP)

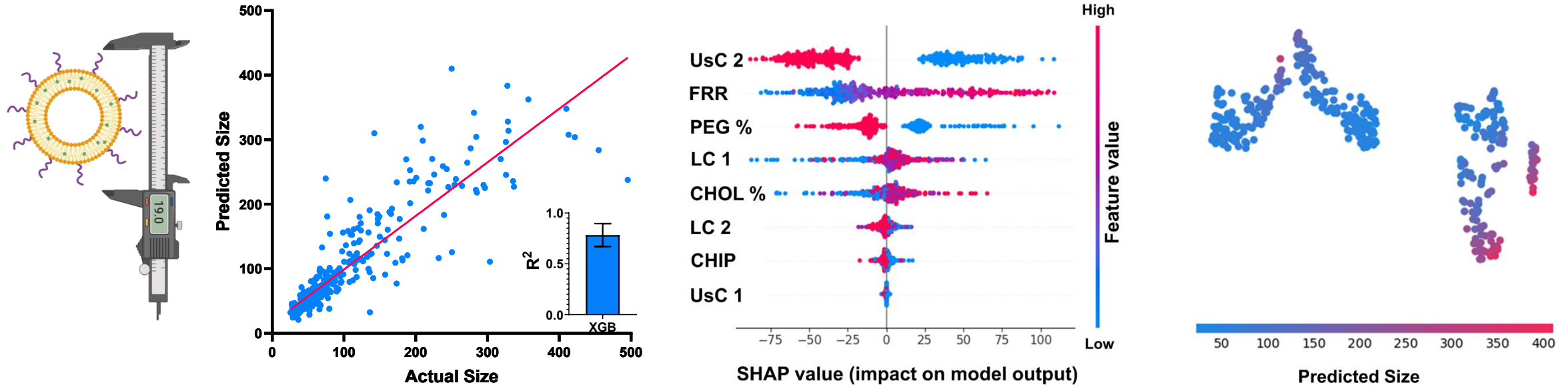


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Predicting Size

A parameter of paramount importance in parenteral drug delivery

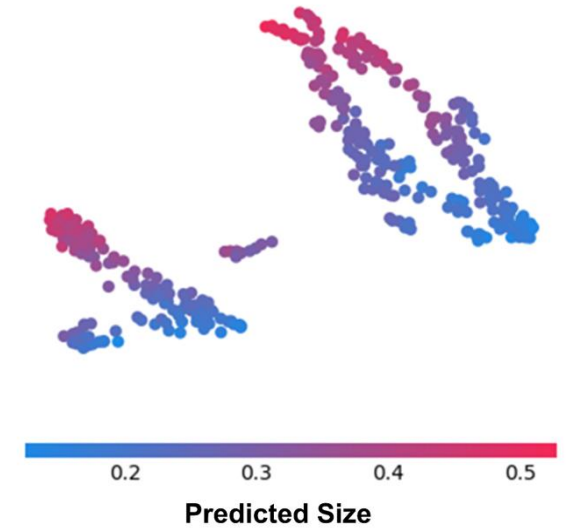
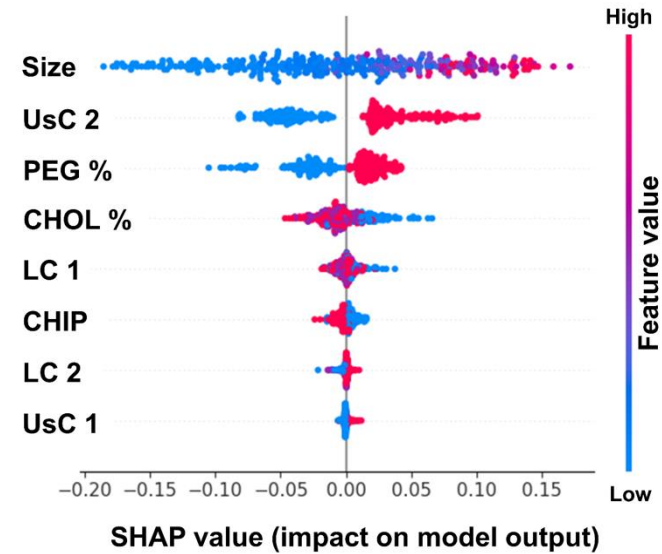
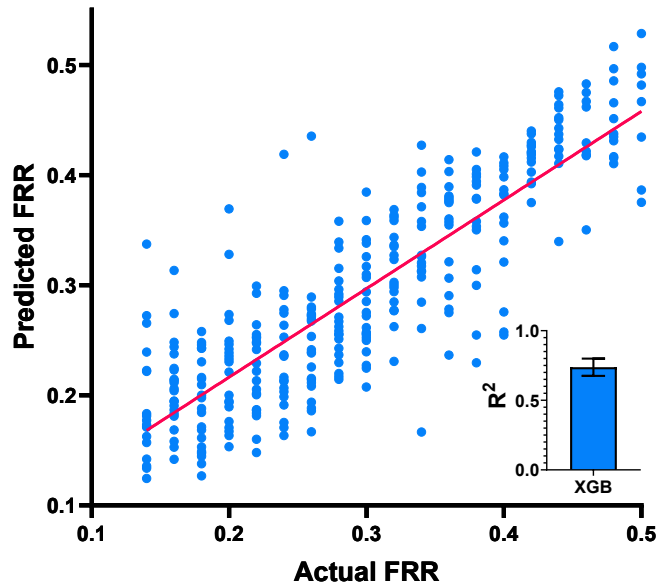
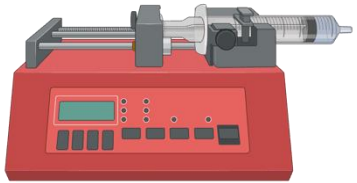


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Predicting FRR

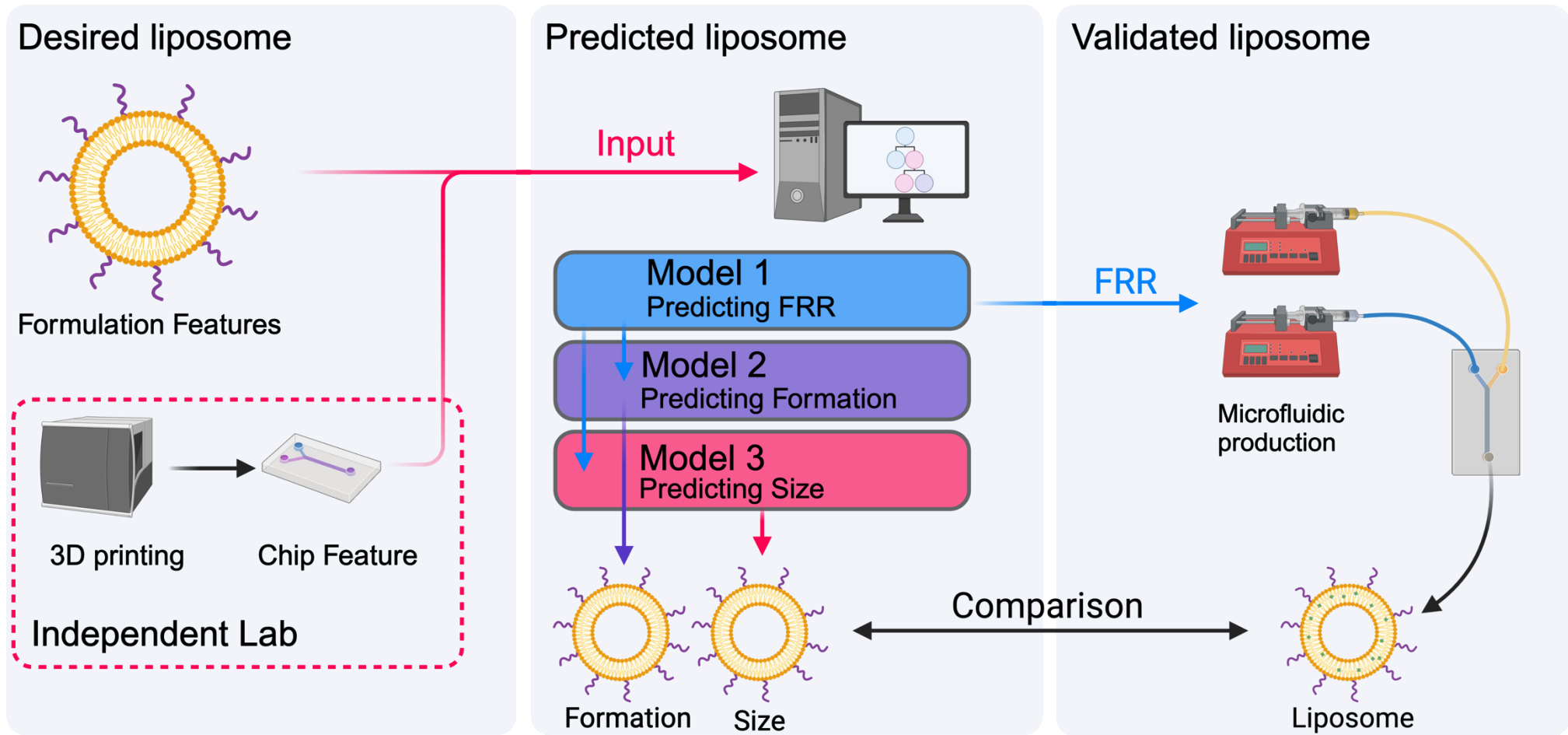
Scaling liposome production is challenging, often requiring a shift towards microfluidics as traditional methods fail to scale.



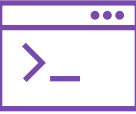
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Wet lab validation

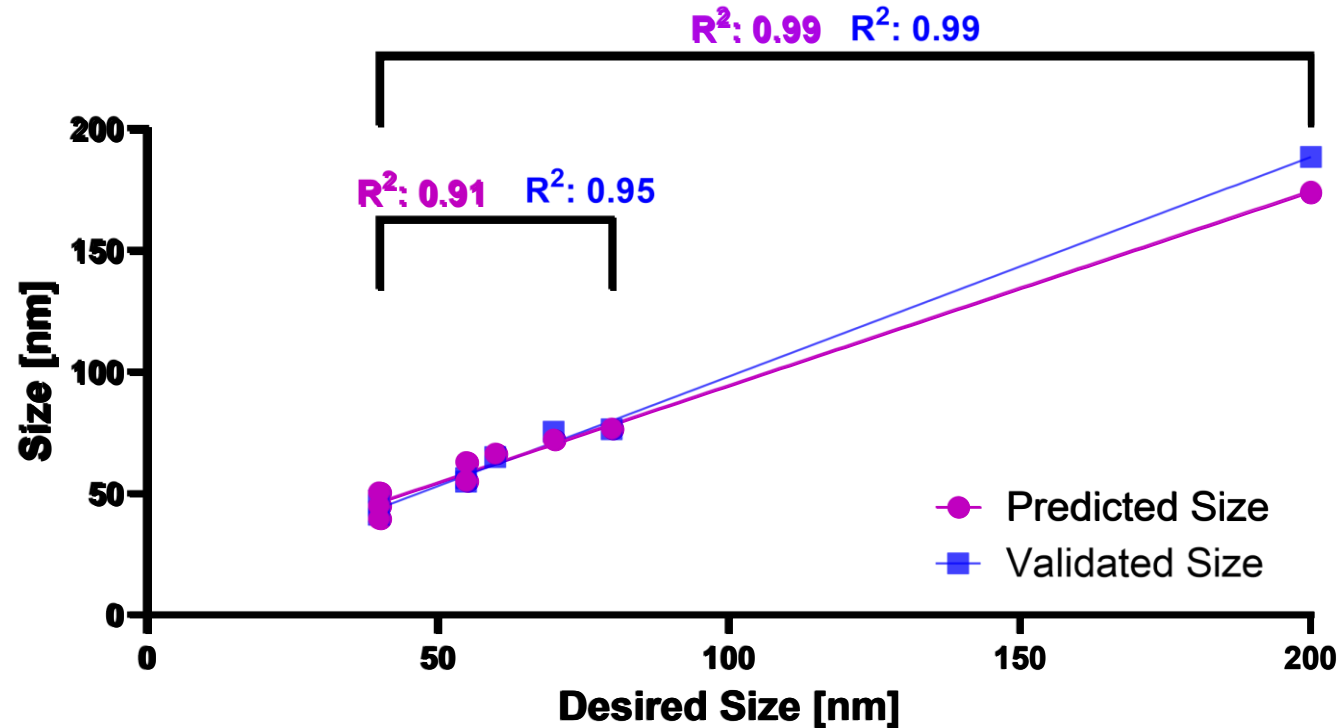


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Wet lab validation

The model reliably identified robust production regions, reducing trial-and-error.

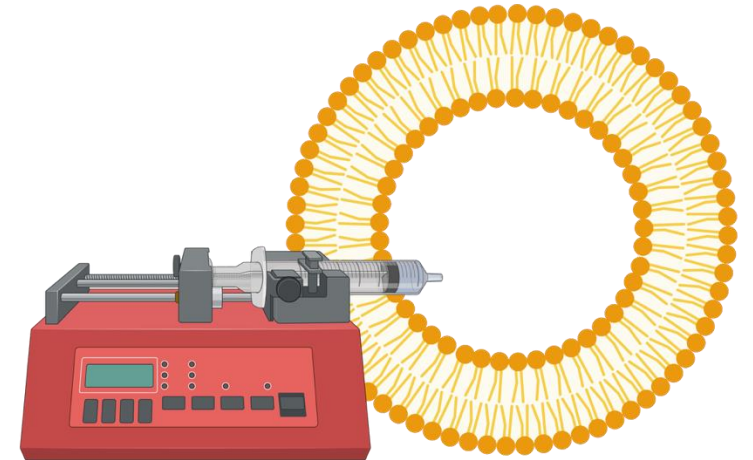


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From labs to computers

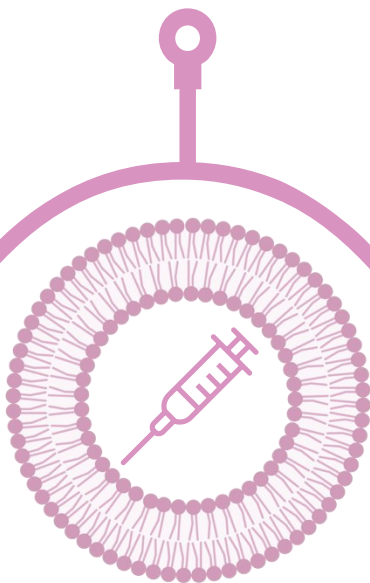


Predictive models reduce experimental burden, accelerate development, and de-risk the scale-up from batch to microfluidics.



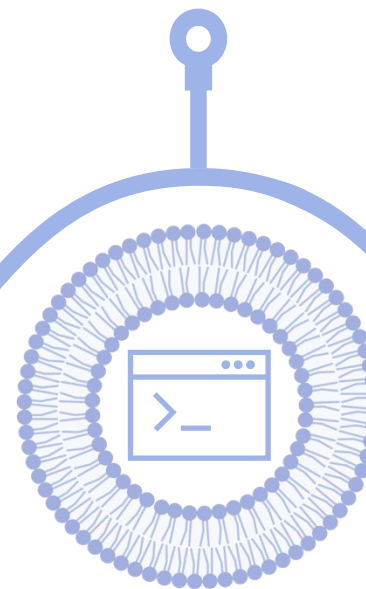
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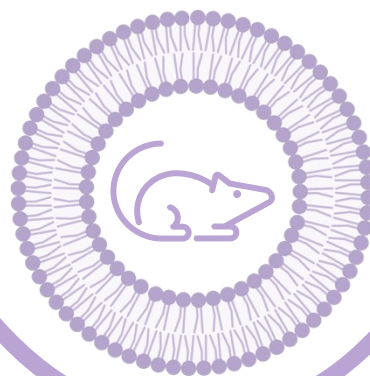
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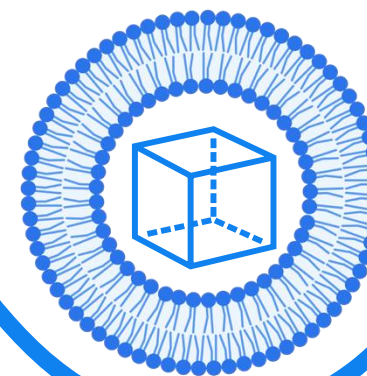
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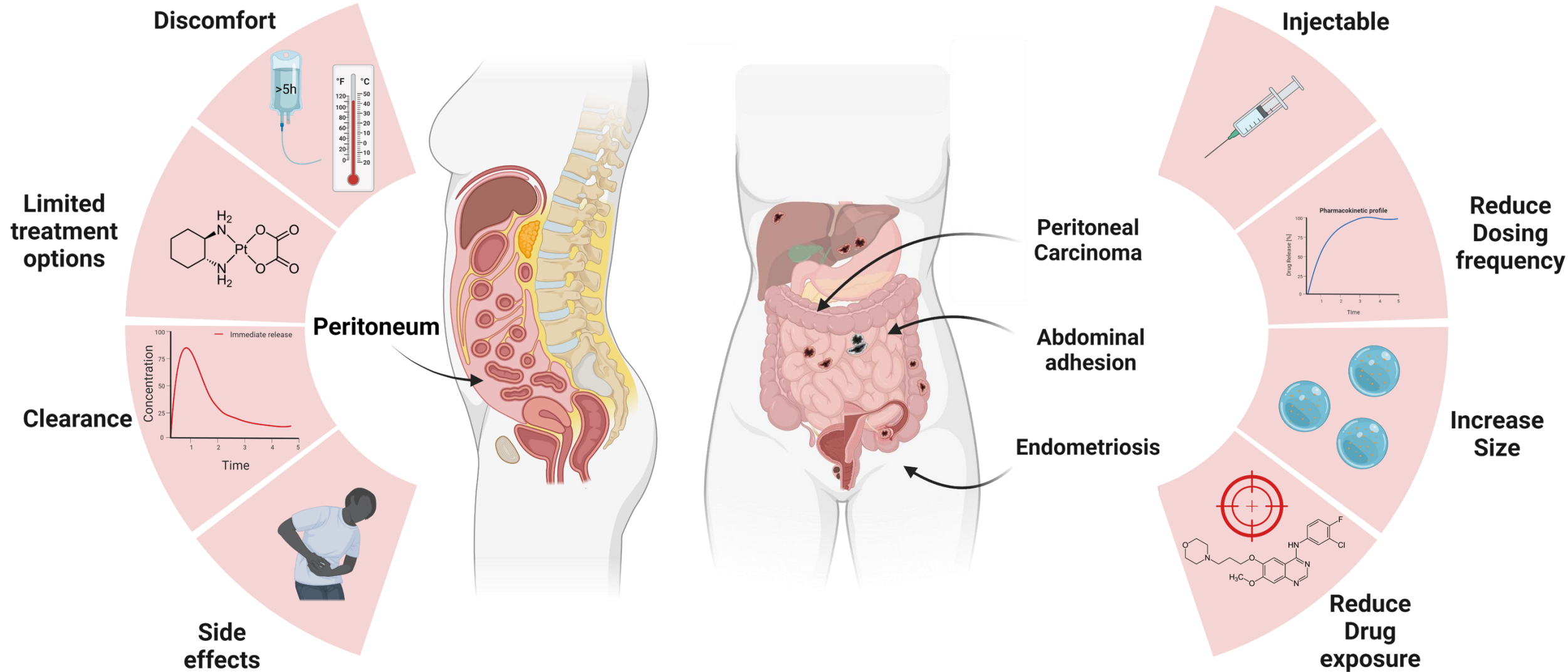
Advanced delivery

Developing composite drug delivery systems



Challenges of Peritoneal Drug Delivery

Peritoneal diseases, pose treatment challenges

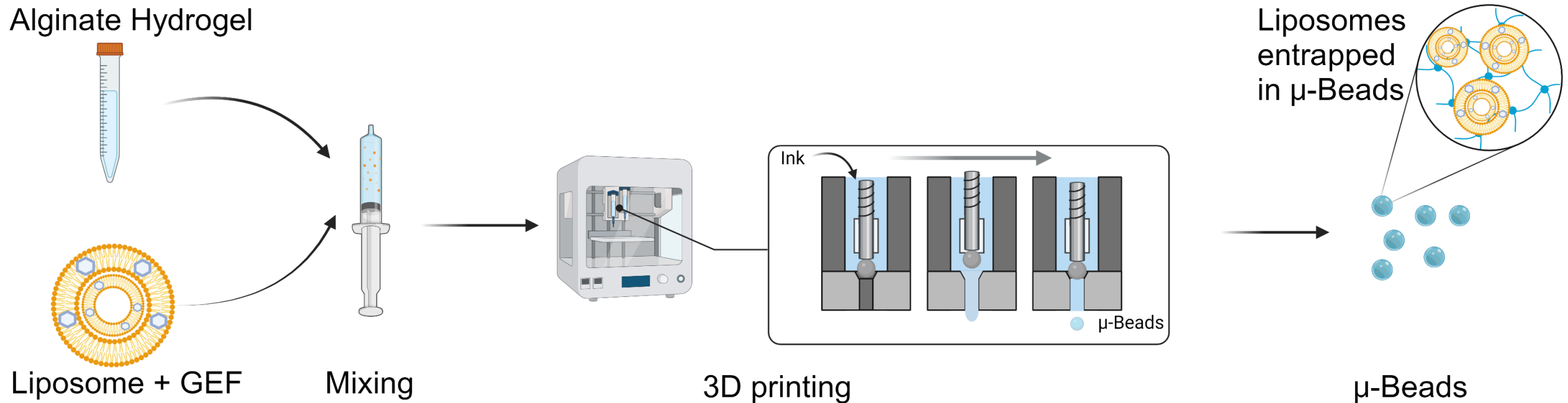


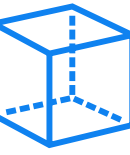
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Liposome loaded beads – A novel approach

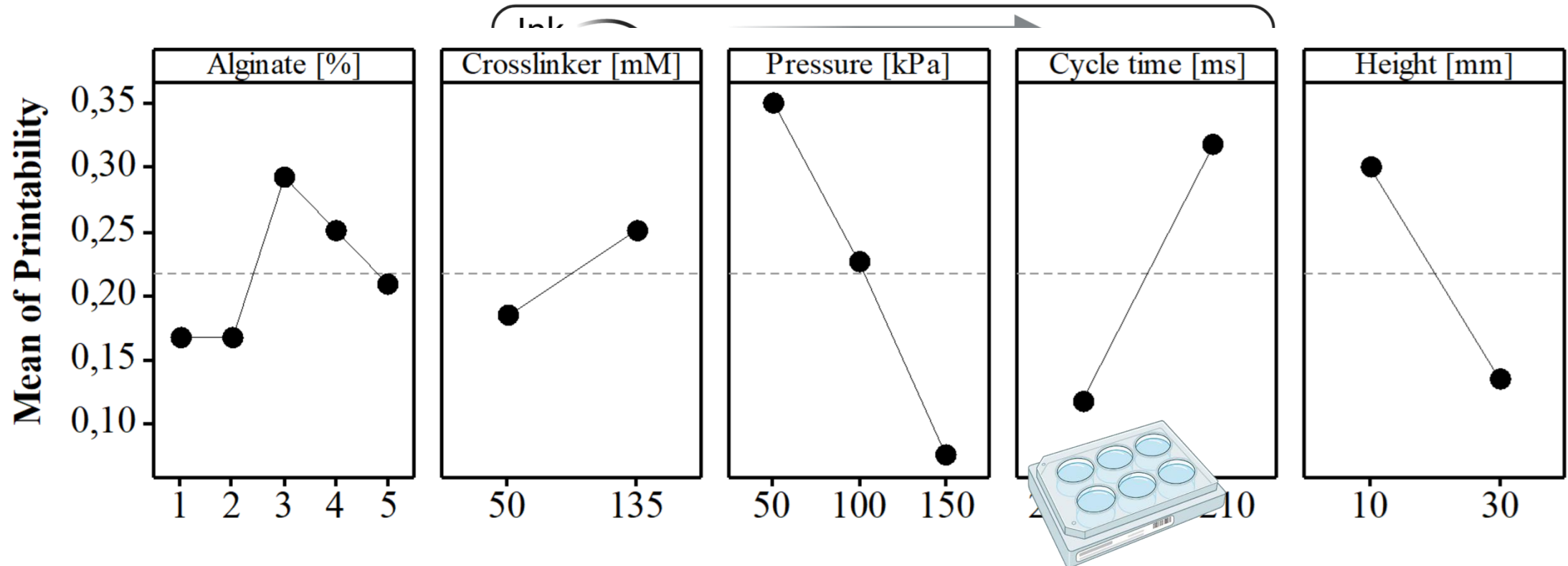
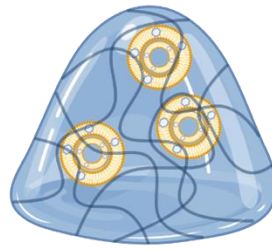
Tackling drug delivery hurdles to the peritoneal cavity



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Drug product ink

EMD printhead overcoming limitations of μ -bead synthesis

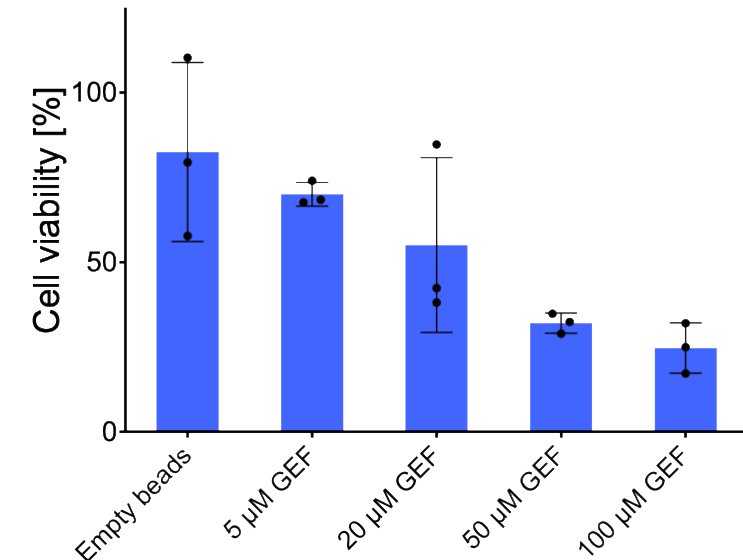
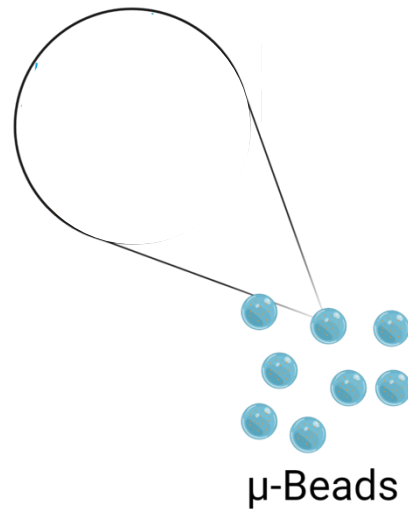


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Therapeutic potential

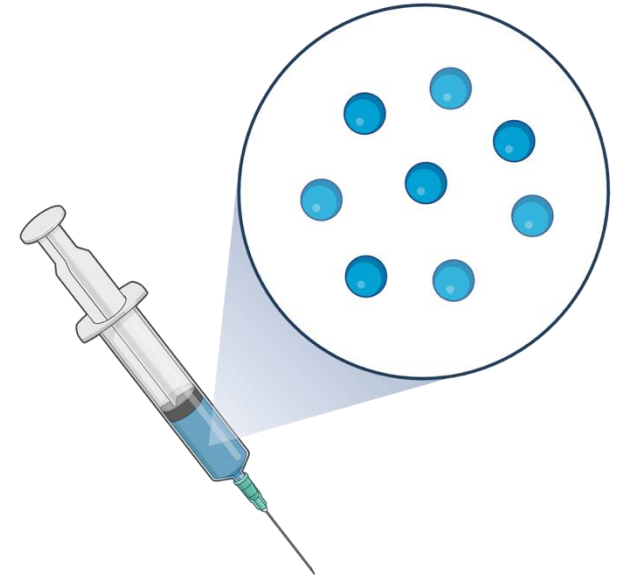
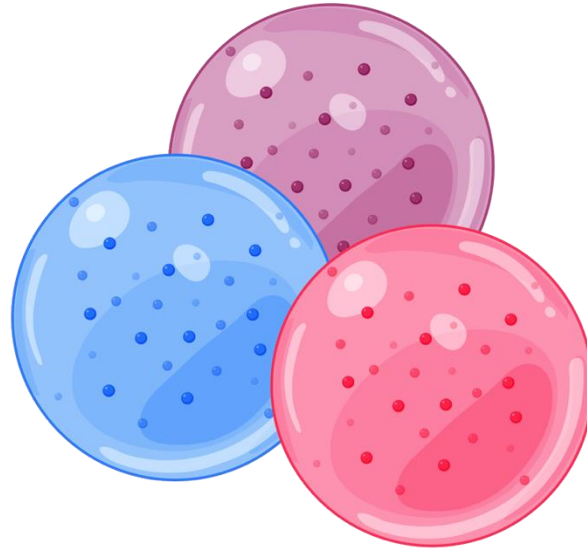
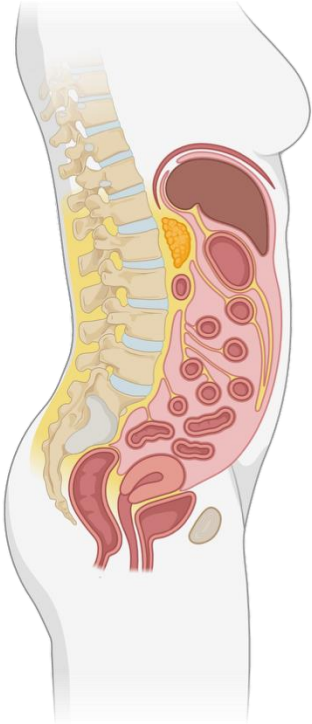
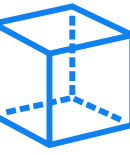
Assessing the μ -beads in a model of human hepatic cancer underscores the efficacy of the composite formulation



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Toward patient-centric peritoneal therapy

3D-printed microbeads offer localized treatment, tunable kinetics, and compatibility with diverse drugs.

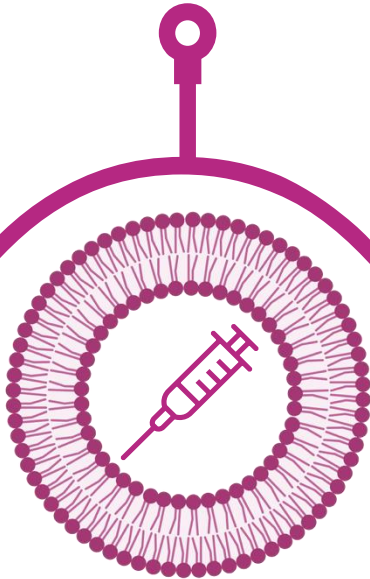


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Digital, ethical, and translational drug delivery

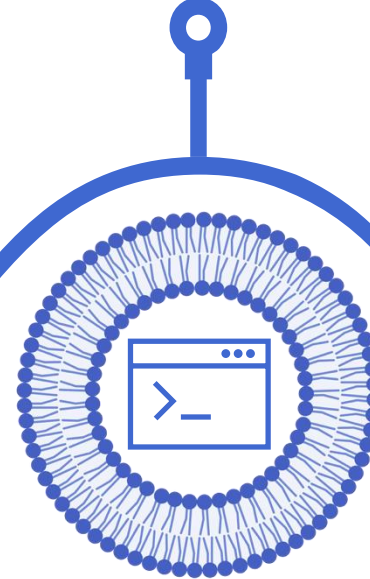
Computational design

A computationally designed in situ liposomal depot demonstrated how digital tools can rationally accelerate formulation development and achieve translational performance.



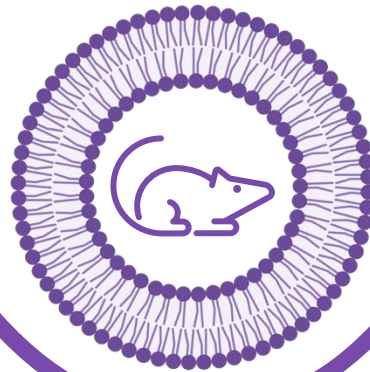
Predictive manufacturing

Machine learning extended this digital paradigm by predicting microfluidic liposome formation, reducing experimentation and enabling scalable, continuous manufacturing.



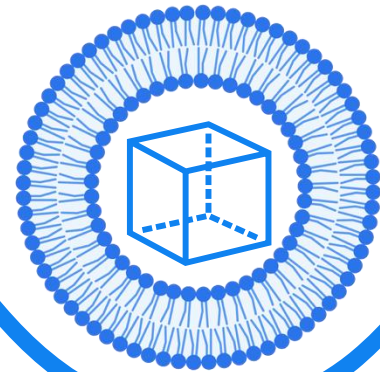
New alternative methods

New experimental and computational models showed that data-driven approaches can replace animal studies while improving mechanistic insight into s.c. drug delivery.



Advanced delivery

Additive manufacturing further expanded digital formulation design, enabling precise fabrication of liposomal microbeads and stents.



u^b

Thanks!

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