

# AI-Powered Structural Bioinformatics and Computational Technologies for Drug Discovery



3rd Leiden Drug Development Conference (LDDC-3)  
19 September 2024



**Kanin Wichapong, PhD**

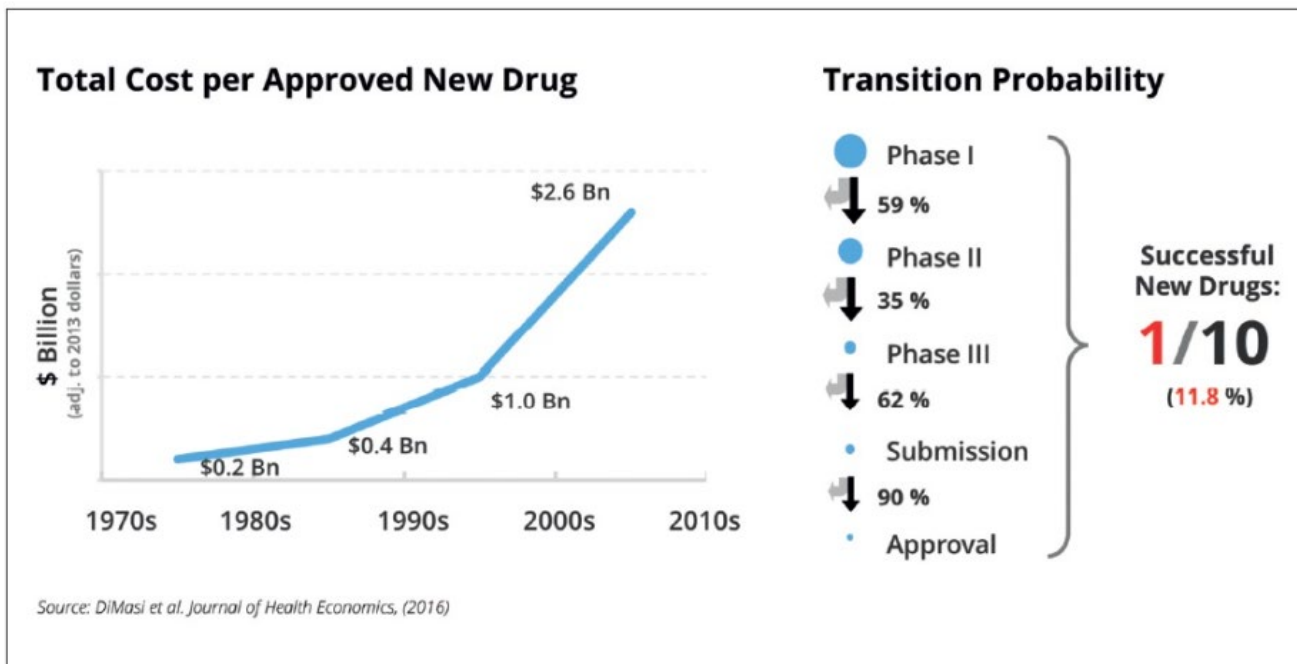
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# Hillmark B.V.

## The problem

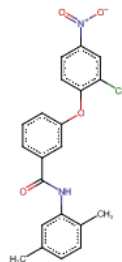
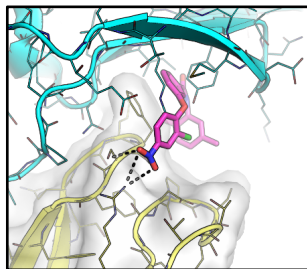
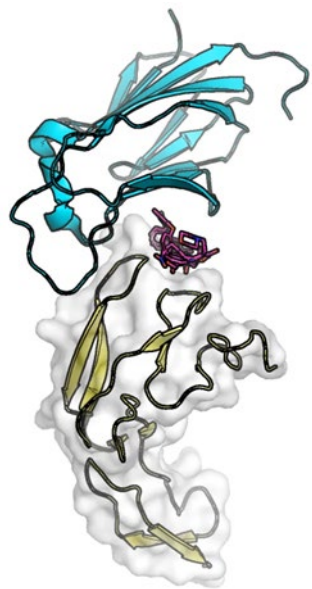
Companies spend more than ever on new drugs  
**but** few make it to the market



# Hillmark B.V.

## The opportunity

Hillmark promises smarter discovery and optimization through computational rationalized, **green** and **sustainable** approaches

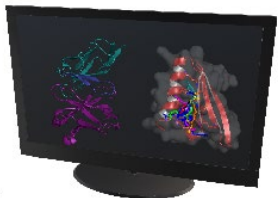


*Computational structure-based  
molecular design and lead finding*

- *accelerated discovery & development*
- *focused discovery through application of in silico ADME-Tox filters*
- **reduction in time and cost**
- *more focused in vitro testing avoiding unnecessary testing and reduction of waste → lowering of environmental fingerprint*

# Development of Bioactive Compounds

## *In Silico Methods*



- Structure-Based Virtual Screening
- Rational Molecular Design
- Molecular Docking
- MD simulations
- BFE calculation
- AI/ML

## *Experiments*



- Protein Purification
- In vitro Assays
- Cell-based Assays
- Direct Binding Measurement (SPR and ITC)
- In vivo

Small Compounds

Therapeutic Proteins

Peptides

Molecular Degraders

## Drug Targets:

- Enzymatic Proteins
- Receptors
- Protein-Protein Interactions
- IDPs/IDPRs (Histones)
- Both intracellular and extracellular



## Drug Targets in:

- Inflammatory Diseases
- Cardiovascular Diseases
- Sepsis
- Cancer
- Viral Diseases

# How do we do it?

## In Silico Methods

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# HILLMARK

*smart lead design and consulting*

**Showcase  
Projects**

**TECHNOLOGY**

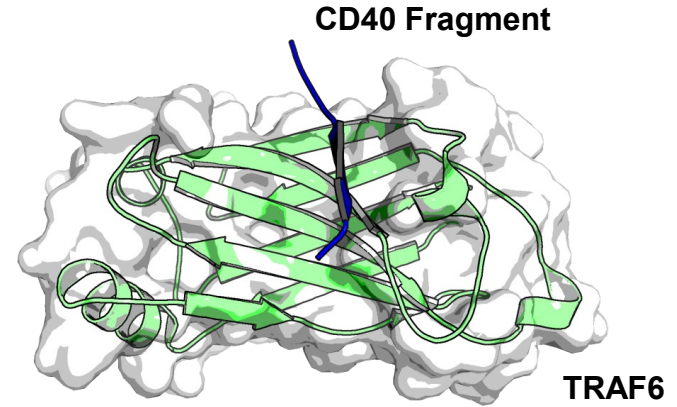
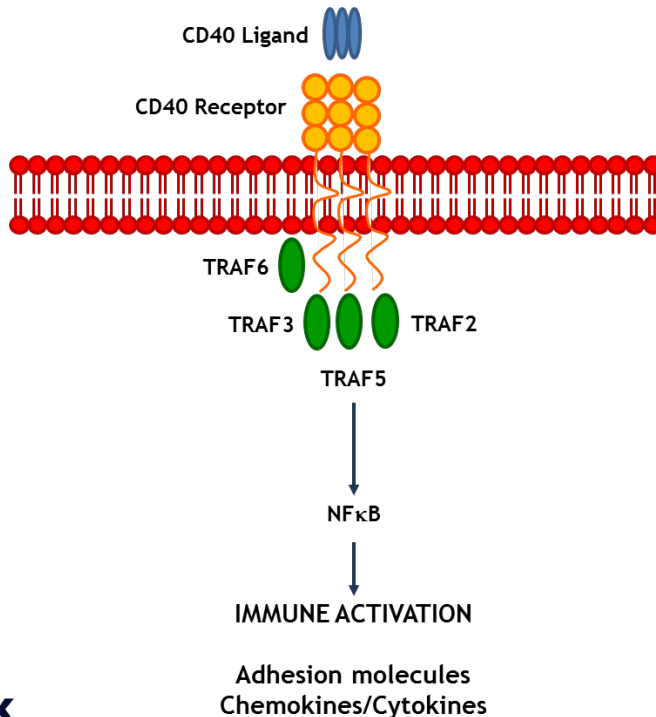
# Showcase 1: Development of Small Molecule Inhibitors

## Structure-Based Virtual Screening (SBVS) to Identify Novel TRAF6 Inhibitors

**Other Successful Study Targets:** coagulation factors V and VIII, Dengue Protease, AMPK, Myt1 Kinase, Activated Protein C, SecA, Streptokinase, TRAF2, SARS-CoV-2 RdRp, SMPD3

# TNF Receptor Associated Factor - TRAF

## Adapter proteins in CD40 signaling



PDB ID 1LB6: TRAF6-CD40 Complex

➤ **CD40-TRAF6 interactions drive atherosclerosis**

**AIM:** To develop inhibitors to disrupt CD40-TRAF6 interactions

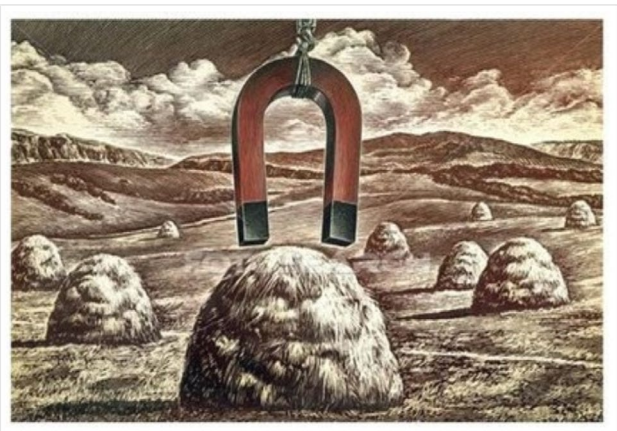


# Find a New Compound – Finding a Needle in a Haystack

<https://zinc.docking.org/>

**ZINC database** – a DB of commercially-available compounds

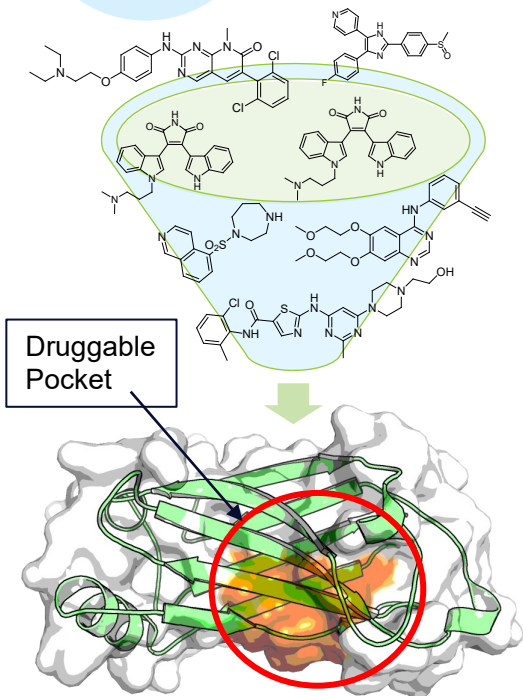
- contains **over 750 million purchasable compounds**



**HOW?**



# Structure-Based Virtual Screening (SBVS)



**ChemBridge Collection**  
~ 400,000 unique compounds



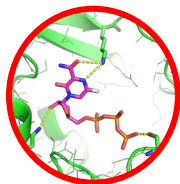
ADME-Tox Filtering  
Drug-like Properties

**Filtered Database**  
~270,000 compounds



Several Steps of  
Molecular Docking  
(AI-Powered Docking)

**Post-Docking Analysis**  
800 compounds



**Protein-Ligand Interactions**

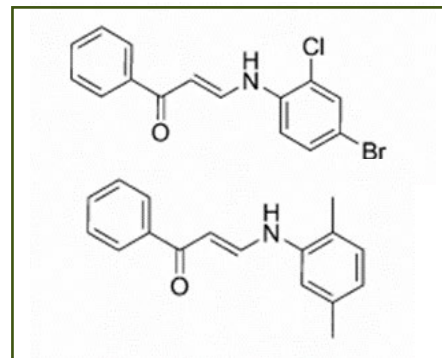


**Score & Ranking**



**Experiments**

**> 50 Hits**



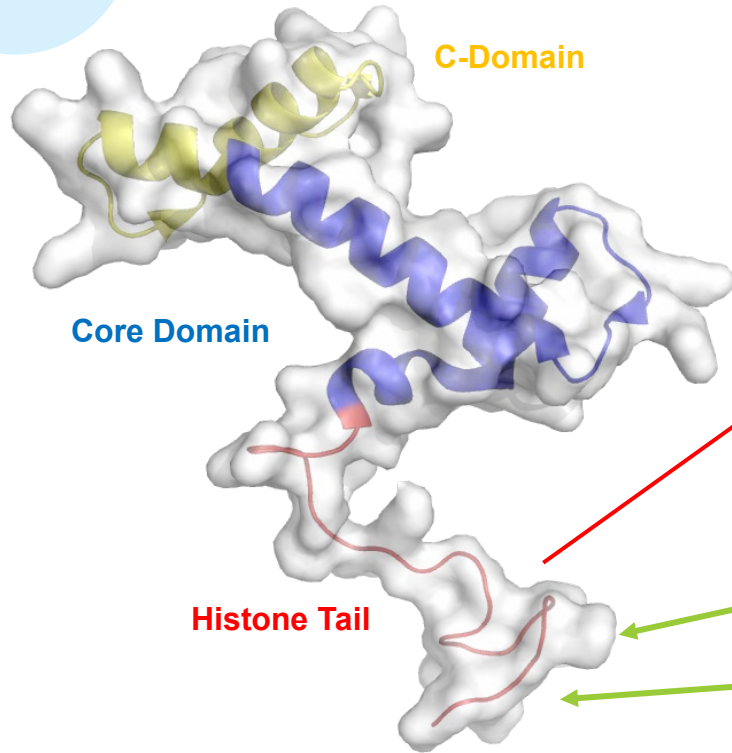
- Higher hit rate than HTS
- $IC_{50}$  at low  $\mu M$  level
- Inhibitory Activity in both *in vitro* & *in vivo* experiments

# **Showcase 2: Design and Development of Peptidic Inhibitors**

## **Structure-Based Methods to Develop Peptidic Inhibitors Targeting Extracellular Histones**

**Other Successful Study Targets:** CCL5-HNP1, GPIb $\alpha$ -VWF A1, CXCR4-CXCL12

# Targeting Extracellular Histones



**Histones:** Sepsis, COVID-19, Thrombosis  
Atherosclerosis etc.

**N-terminal Histone - the major domain activating cell death**

- Intrinsically Disordered Region (IDR)
- unstructured proteins, lacking stable secondary or tertiary structures
- no druggable pocket

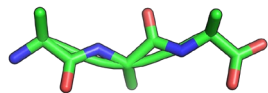
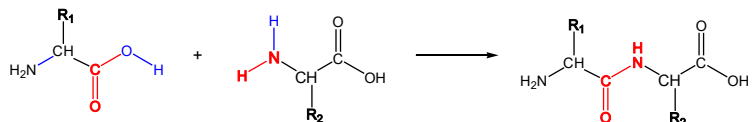


**Peptides**

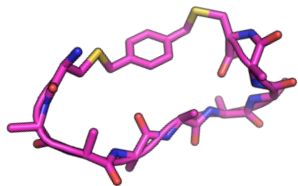
**Engineered  
Proteins**

# Peptide Design

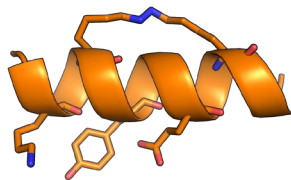
**Peptide** - A compound consisting of two or more amino acids linked by a peptide bond



Linear Peptide



Cyclic Peptides



Stapled Peptides

other types of peptidic inhibitors (or peptidomimetics):  
D-Amino Acid peptides, Backbone extension, C $\alpha$ -replacement etc.

## Peptide design is challenging

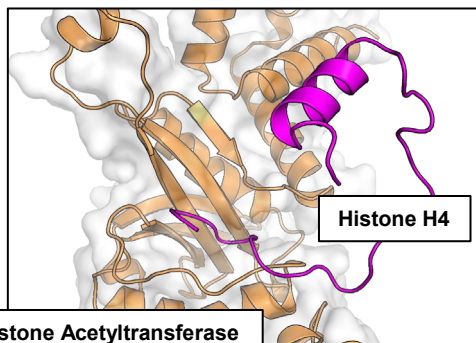
|                    |   |                      |
|--------------------|---|----------------------|
| Peptide with 2 AA  | = 20 X 20   | = 400                |
| Peptide with 3 AA  | = 20 X 20 X 20  | = 8,000              |
| Peptide with 4 AA  | = 20 X 20 X 20 X 20                                     | = 160,000            |
| .                  |   |                      |
| .                  |   |                      |
| .                  |   |                      |
| Peptide with 10 AA | = 20 X 20 X 20 X 20<br>X 20 X 20 X 20 X 20<br>X 20 X 20 | = 10,240,000,000,000 |
| .                  |   |                      |
| .                  |   |                      |

More than 10,000 billion possibilities

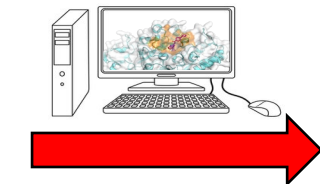
How to find one potential peptidic inhibitor from these 10,000 billion candidates?

# Structure-Based Peptide Design: Histone H4 Inhibitors

## 1. Identification of (related) Protein-Protein Complex

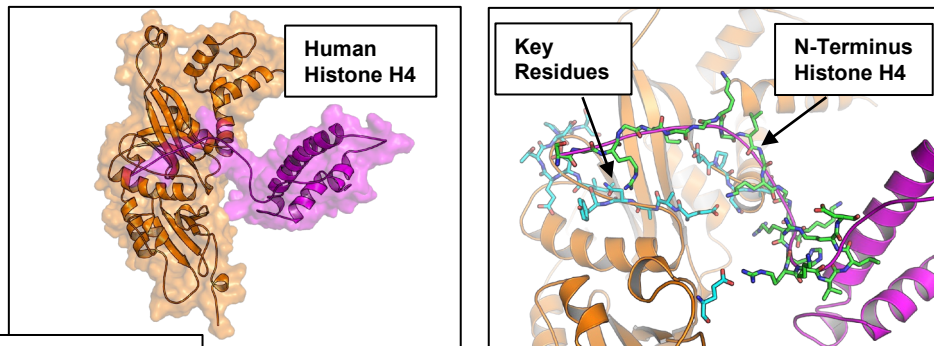


PDB 4PSW: histone acetyltransferase in complex with *Ophiophagus Hannah* histone H4



Protein-Protein Docking  
MD Simulations

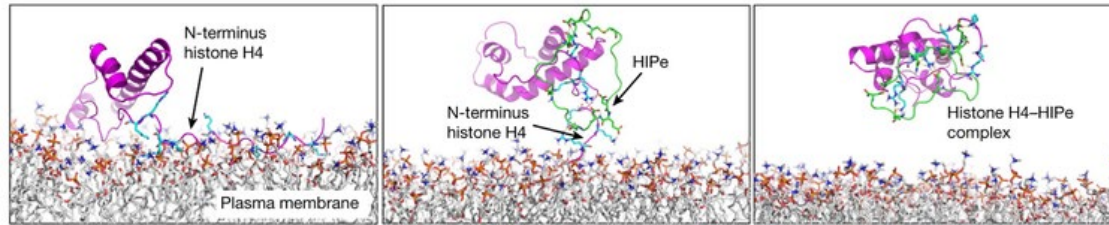
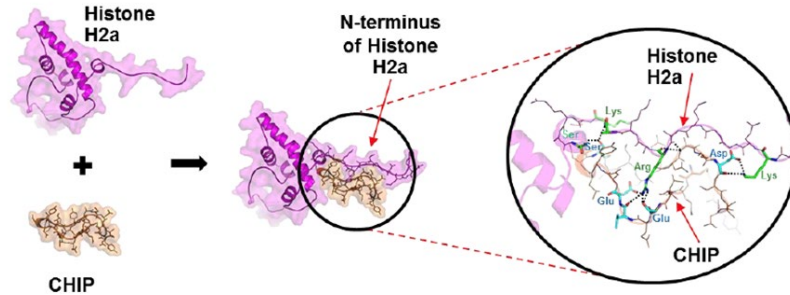
## 2. Determination of histone H4-binding protein complex



## 3. *In Silico* Peptide Design

## 4. Binding Free Energy (BFE) Calculations

# Anti-Histone Peptide Inhibitors



## Newly Developed Histone Inhibitors

- demonstrate inhibitory activity (*in vitro* and functional assays)
- exhibit potential therapeutic benefits in mouse models

Peptide contains 28 AA  
=  $20^{28}$  possibilities

*in silico*: 9 cyclic peptides were designed



*in vitro*: 4 peptides were selected for testing.



*in vivo*: 1 potent peptide shows therapeutic benefits.

# Showcase 3: Design and Development of Therapeutic Proteins

**Engineered Therapeutic Proteins: Novel Activated Protein C (APC) variants**

**Other Successful Study Targets:** Factor V, Factor VIII, ADAMTS13, Prothrombin, Protein S, Annexin A5



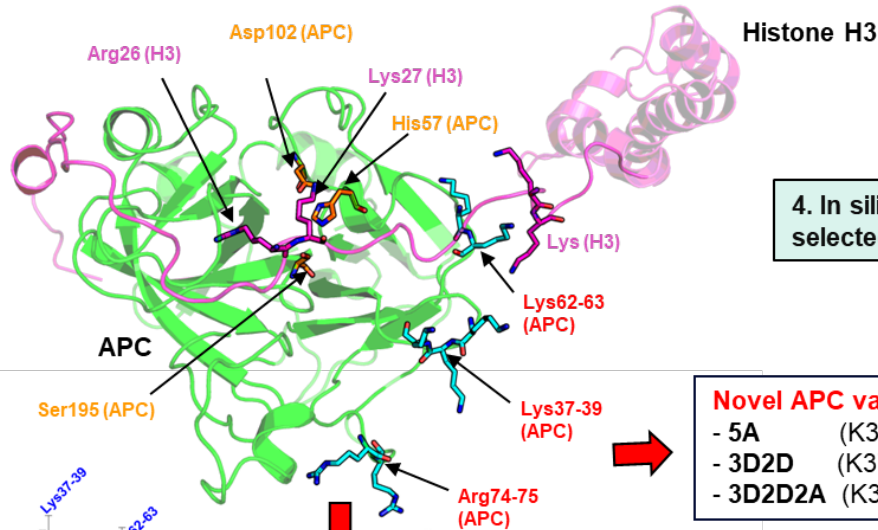
# Design of Novel APC Variants

APC contains 461 residues:  
possibilities =  $20^{461}$

1. Protein-Protein Docking  
(APC-Histone H3 complex)

2. MD simulations of the  
selected docking pose

3. BFE calculation and  
per-residue energy  
decomposition (DC) analysis

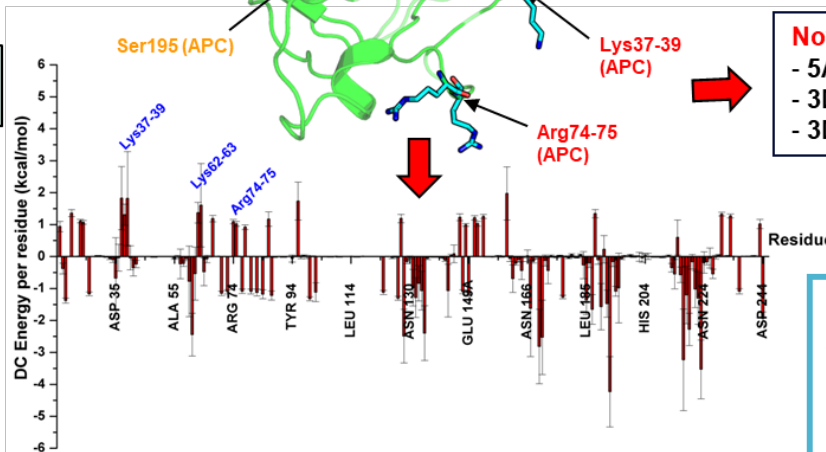


4. In silico mutation of  
selected residues

**Novel APC variants:**

- 5A (K37-39A + R74-75A)
- 3D2D (K37-39D + K62-63D)
- 3D2D2A (K37-39D + K62-63D + R74-75A)

Protein  
Purification  
& Experiments



**The novel 3D2D- and 3D2D2A-  
APC variants show**

- a decreased anticoagulant activity
- an improved binding to histone H3
- an ability to proteolyze histone H3

# Conclusion



By use of computer-based methods (*in silico*),

- we can significantly reduce numbers of compounds subjected to experimental testing (*in vitro* & *in vivo*)
- we have developed lead compounds:

## Structured Proteins

RdRp

TRAF2/6

Kinases

FV/FVIII

## PPIs

CCL5-HNP1

CXCR4-CXCL12

TRAF6-CD40

ADAMTS13-Ab

GPIb $\alpha$ -VWF A1

- Small-Molecule Inhibitors / Activators
- Peptides
- Engineered Proteins

## IDPRs

Histones

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<https://www.3dstructure-function.nl/>  
<https://www.hillmarkbiopharma.com/>



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# Thank you for your Attention