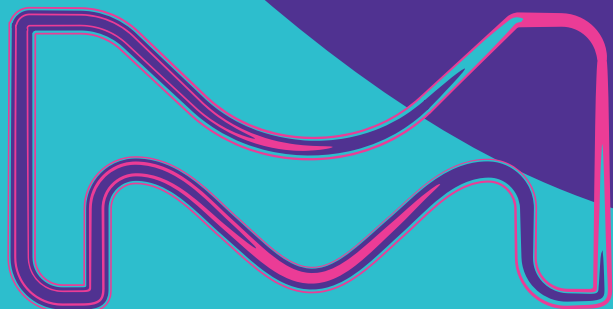




X-RAY CRYSTALLOGRAPHY AND STRUCTURAL BIOLOGY IN THE PROCESS OF DISCOVERY AND DEVELOPMENT OF NEW DRUGS

Matthias Frech
Lisbon, July 2022

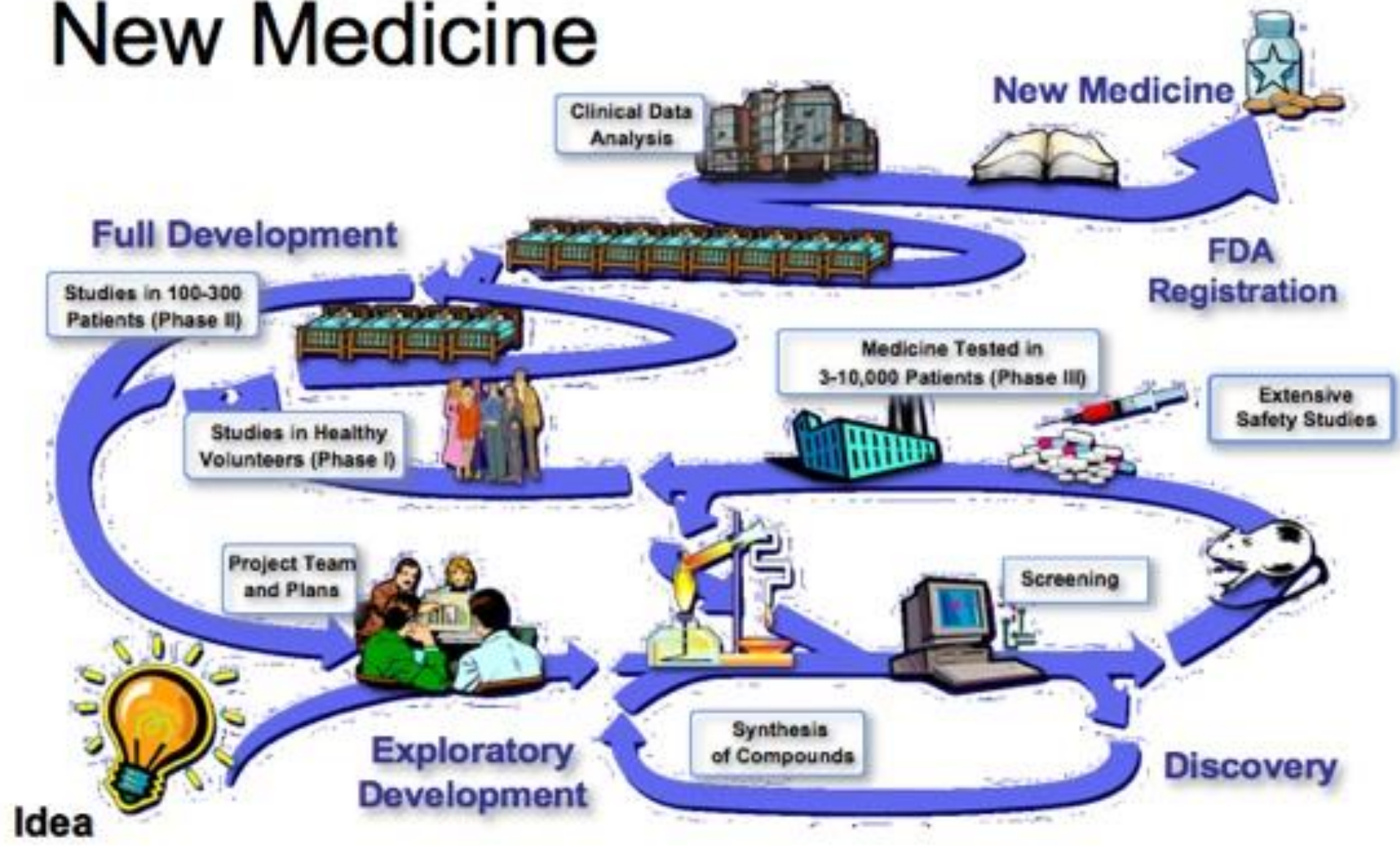


MERCK

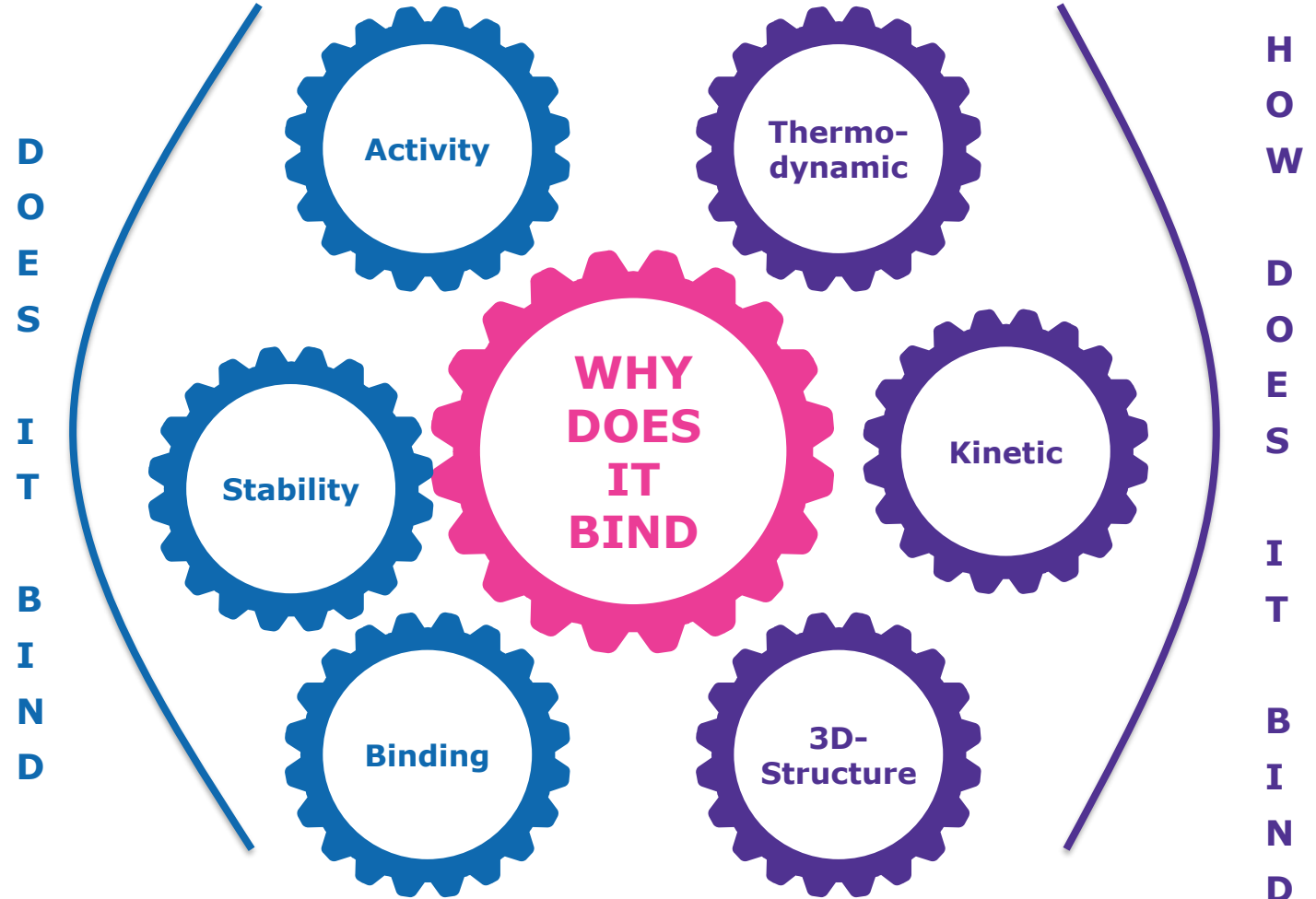
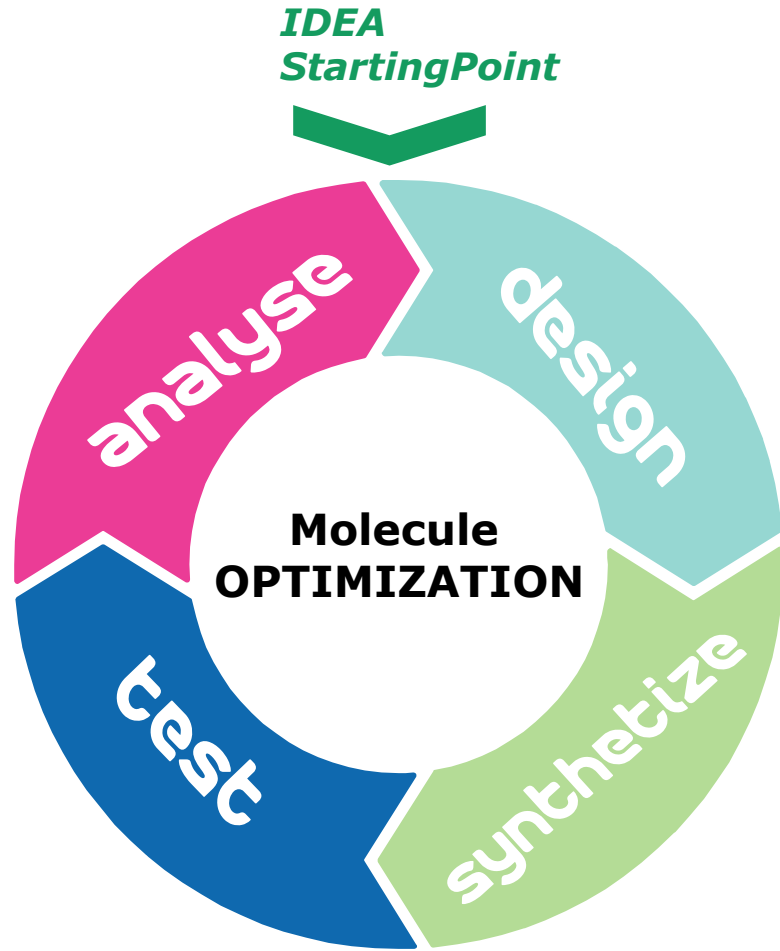
Agenda for today

- Introductory remarks on the Drug Discovery Process, with special focus on the early phase
- Where to place Crystallography / Structural Biology
- The Organization and Automation to get Structural Information
- Selected Examples
- Outlook

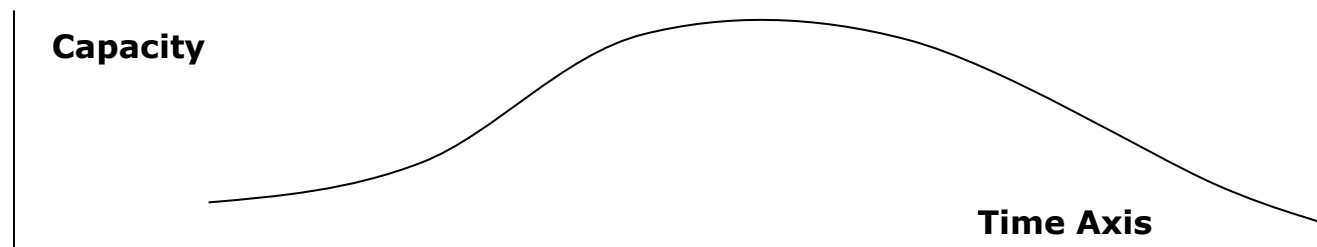
The Long Road to a New Medicine



Dissection of Molecular Interaction



Structural Biology is an essential Part in the early Phase of the Drug Discovery Process



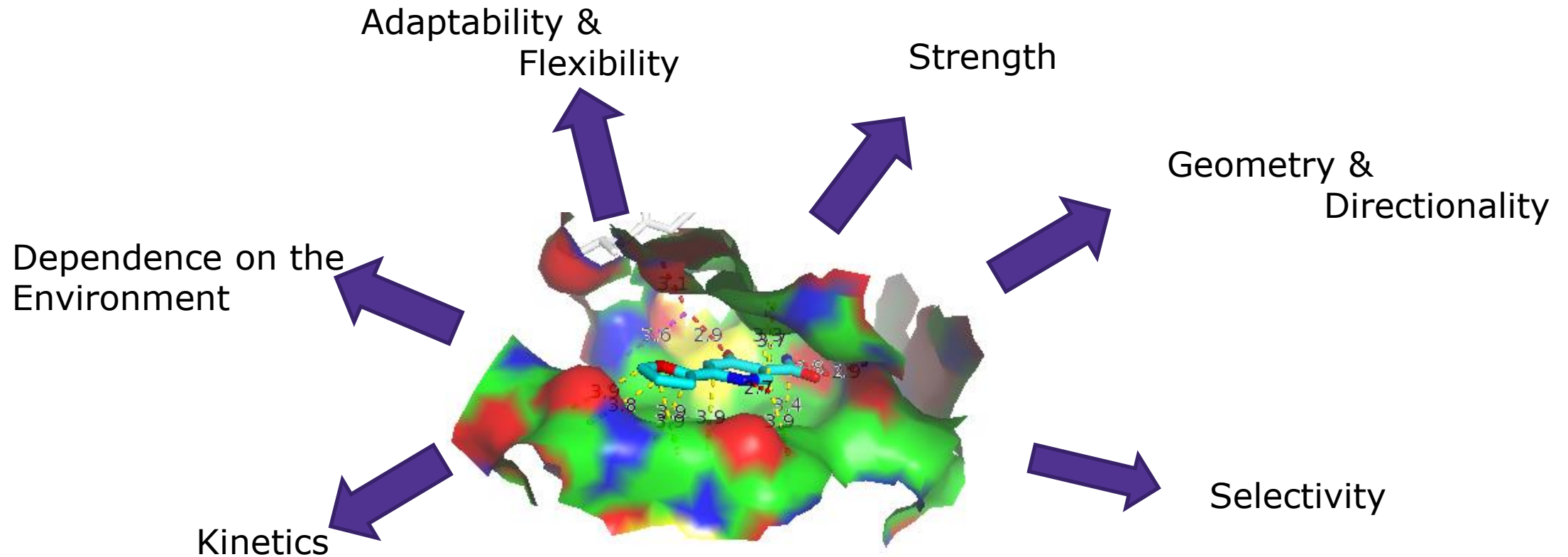
- Validation and ranking of HTS hits
- Identification of promiscuous binders
- Hit series prioritization
- Fragment screening

Verification of target-ligand, target-substrate or target-small molecule interactions

- Protein Co-crystal structures to deliver insight into binding modes
- Support of chemical synthesis by delivering thermodynamics and kinetics as additional decision criteria
- Rank very high affinity binders
- Gaining insight into mode of mechanism
- Profiling of drug candidates and backup series regarding their binding to isoforms or homologs of the target protein

Molecular Interactions for New Chemical Entities

Can be regarded as „bridge“ between the world of chemistry and biology.



- Valuable and instrumental to manipulate biological functions with molecular precision to eventually generate a benefit for patients.

Structure Biology in Drug Discovery at Merck



Methods we use to get Three Dimensional Structural Information

X-Ray Protein Crystallography

Cryo Electron Microscopy

Protein based Nuclear Magnetic Resonance Spectroscopy

More for analytical questions:

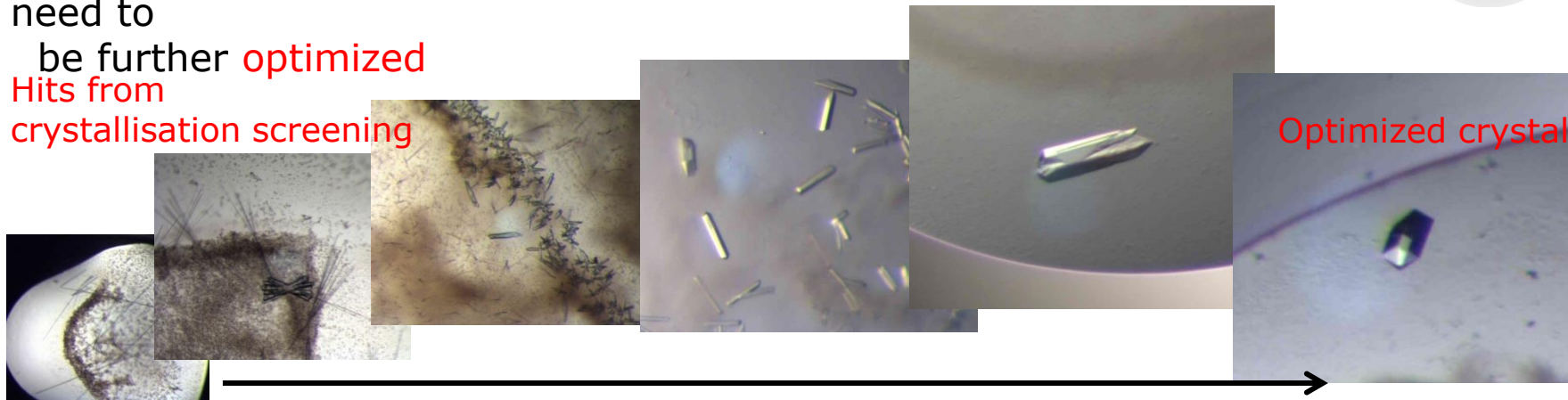
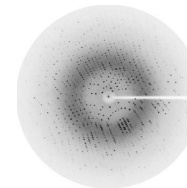
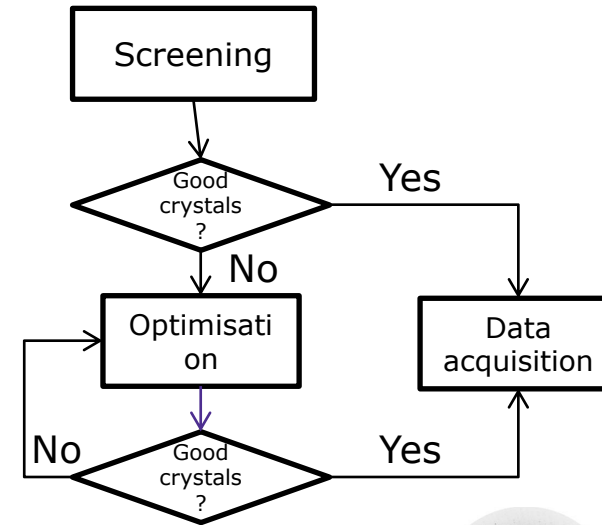
Negative Stain Electron Microscopy

Small angle X-Ray Scattering

Dynamic Light Scattering

Protein Crystallisation – Still tedious

- The buffer composition for optimal crystallisation need to be discovered **empirically**
- The buffer solution contains **precipitants** like PEG or ammoniumsulfate to form crystals
- Different variations of buffer solutions are used for **crystallisation screening**
- Initial crystals from crystallisation screening need to be further **optimized**
Hits from crystallisation screening



Crystallisation

Data acquisition

Data processing

Structure refinement

Publishing

Automation in the crystallisation lab



- **2003: Manually using 1 μ l protein droplet**

1 Screening plate : 90 min 384 screening conditions
1 Opt. Plate: 25 min

- **2005: Tecan Evo using 0,5 μ l Protein droplet**

1 Screening plate : 90 min **576** screening conditions
1 Opt. Plate: 25 min

- **2011: ARI Phoenix using 0,1 μ l Protein droplet**

1 Screening plate : **5** min **1728** screening conditions

- **2013: Formulator using 0,1 μ l Protein droplet**

1 Opt. Plate : **5** min 24 conditions / plate

With the same protein amount,
number of crystallisation conditions
is increased by a factor of 4.5

Automation of crystallisation process

20°C

4°C

20°C

20°C

2003 - 2009

4°C

20°C

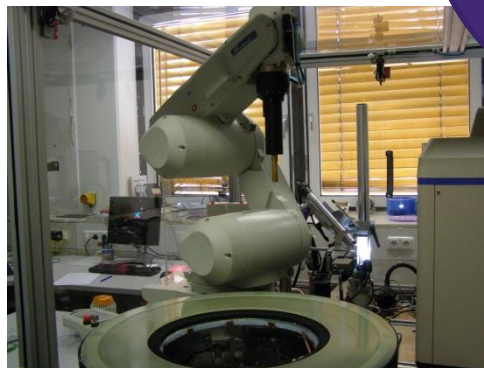
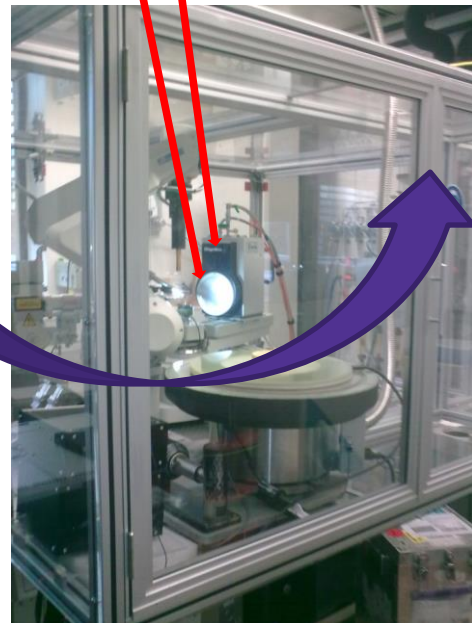
4°C

2009 - today

1000 plates each

MERCK

Characterization of protein crystals in-house



Sample changer

2004: Diffractometer setup

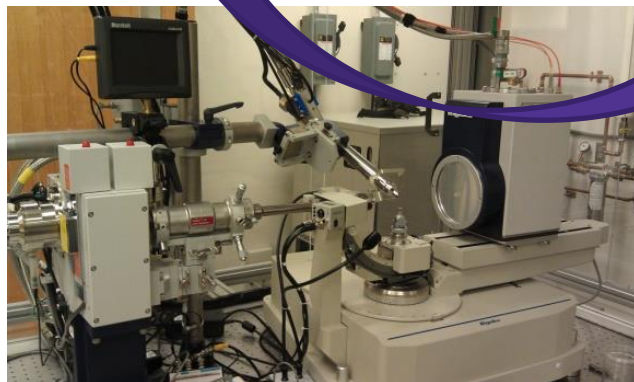
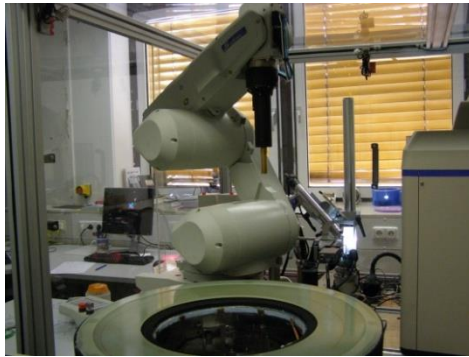
2004-2009: 1 dataset 2-4 days

2008: New 40 Sample changer robot in place

2009: New CCD detector in place
1 dataset 2-3 hours

2020: New X-Ray source installed

Measurement of protein crystals at the Swiss Light Source / Villigen



1 dataset less than 2 minutes

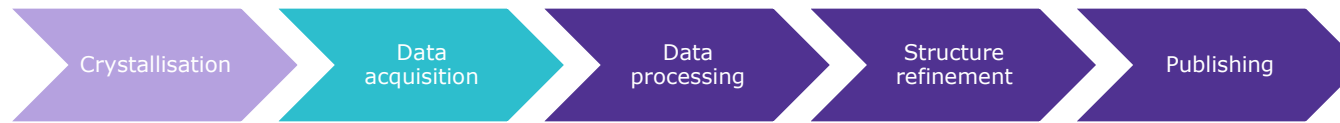
In-house tests with sample changer:
preselection of best diffracting crystals

Automation in Structural Biology

- The process to deliver a protein structure can be divided into a few basic working packages



- **Crystallization** – a partly automated step. To titrate one plate with hundreds of different conditions it takes about 3 min. Plate is transferred manually to the imager system. Continuous observation of protein crystallization is done in an automated way. Inspection and interpretation is done by human intervention.
- **Data Acquisition** - nowadays at the Synchrotron acquiring of a data set takes less than 2 min per protein crystal
- **Data Processing** – process the synchrotron data until a first structure is automated can work with 80 data sets over night. It delivers the information: structure can be solved and refined further, the ligand can be detected
- **Structure Refinement** – the final refinement to a high resolution can take only a day but also weeks of time depending on data complexity, quality, available capacity, experience of involved crystallographer



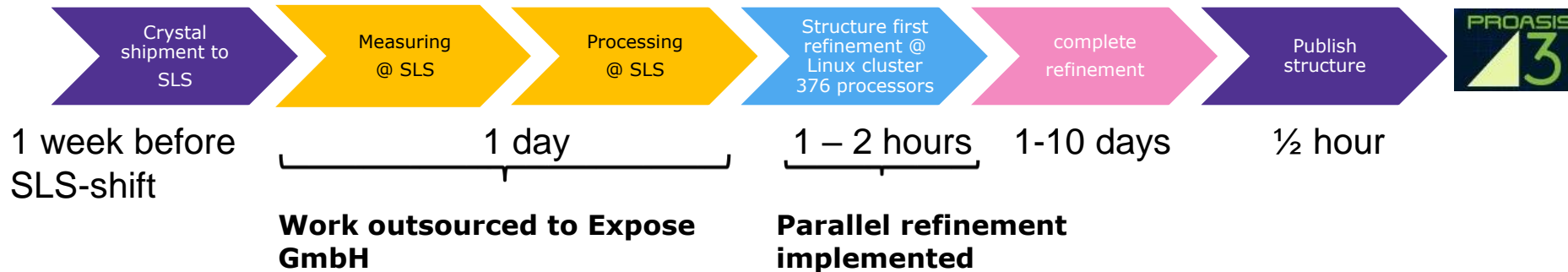
Improvements in timelines for data processing, structure refinement and publishing 2003 - today

Until 2008: Timeline 4.5 – 8.5 weeks



- Travelling to SLS (once per month) and all steps sequentiell

Today: Timeline 1.5 – 3 weeks



- Global coordination of synchrotron logistics between Da, Billerica and IBET/Portugal
- Crystals are shipped to synchrotron (every 3 weeks)
- 1st refinement of up to 98 datasets in parallel

Number of structural requests and solved structures

2011 – 2013

requested structures	766	
Structures delivered	395	
In-house	245	
In collaborative refinement efforts		
Extern	150	

2014 – 2016

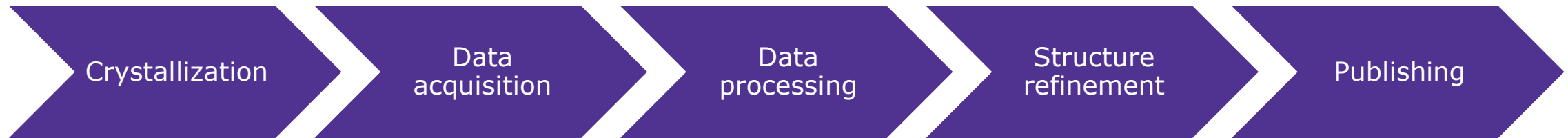
requested Structures	1050	
Structures delivered	583	
In-house	417	
In collaborative refinement efforts		-
Extern		166

2017 (till Nov.)

requested Structures	386	
Structures delivered	275	
In-house	36	
In collaborative refinement efforts		56
Extern		183 (Vertex 116)

We have an attrition in our structure solution process

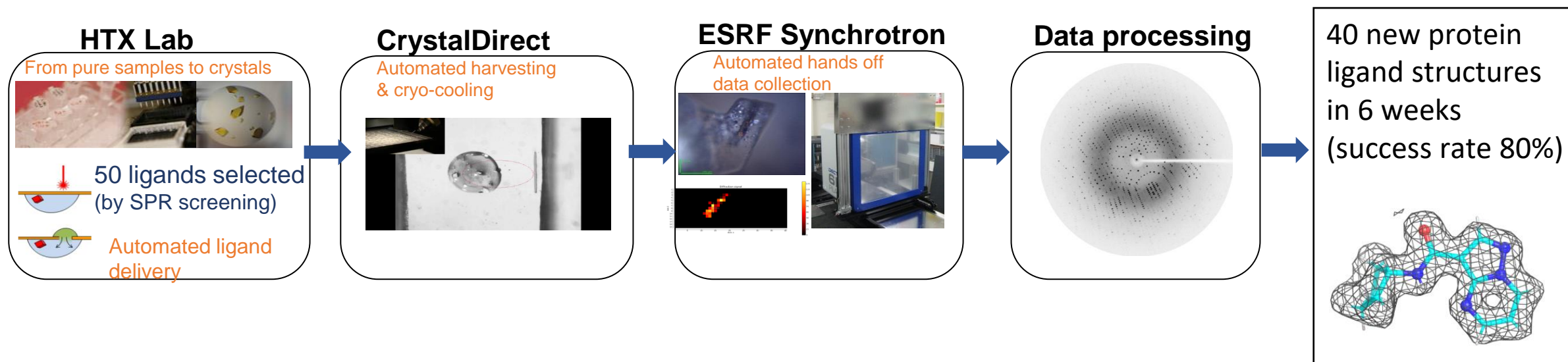
- Within one year 665 crystals were sent the synchrotron.
- This resulted in 360 datasets for processing and refinement
- Which delivered 159 solved structures



- Bundles of co-crystals with defined priorities are shipped to the SLS in Switzerland
- The inhouse produced protein crystals are prechecked with the inhouse Xray source to ensure a basic quality and reduce drop out at the synchrotron.
- The first refinement is done over night. Giving the information: ligand is bound , structure can be refined

High Throughput Protein Crystallization in collaboration with the EMBL Core Facilities (Grenoble)

- High throughput crystallography to complement HTS-Eval generating more diverse structural data set in the early HO phase to support the selection of promising chemical scaffolds.
- Enhanced throughput of selected HO / LO projects to generate protein ligand structures
- Use protein crystallography as a screening method for fragments



- Improved (current) throughput: 50 compounds soaked, measured and bound hits partially refined in 3 weeks
- Appropriate selection of project is mandatory. Soakable system is needed, crystallization system needs be ready at the time of the HTS to facilitate the seamless transfer to Grenoble, Refinement resources needs preparation in advance

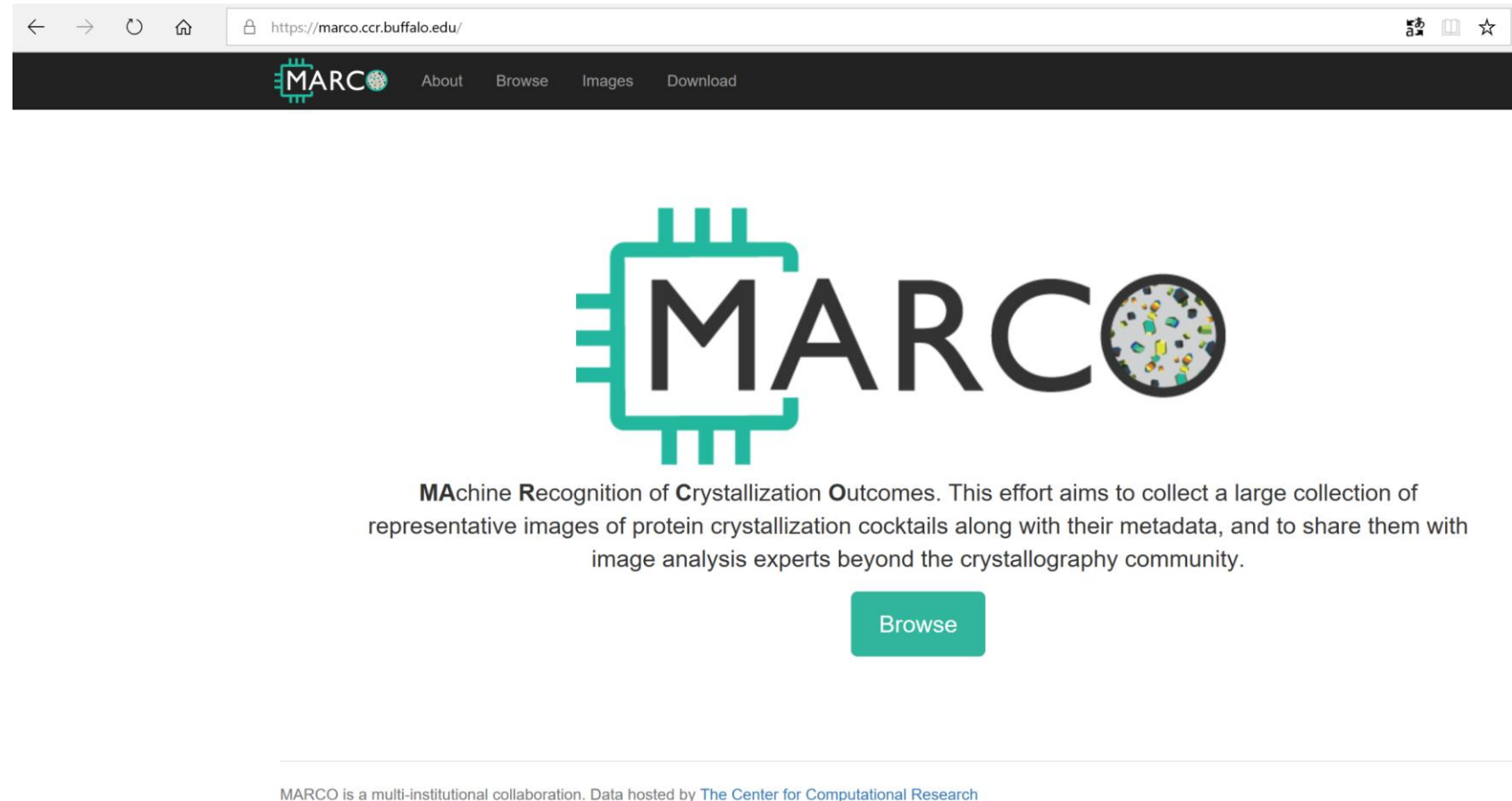
Automated Protein Crystal Detection

MARCO Initiative: pre-competitive initiative

Collaborative initiative to develop an automated computer vision-based system to identify protein crystals with machine learning.

Contributors:

- GlaxoSmithKline
- Merck & Co.
- Hauptman-Woodward Medical Research Institute
- Collaborative Crystallization Centre
- Bristol-Myers Squibb
-



The screenshot shows the MARCO website homepage. The browser address bar displays <https://marco.ccr.buffalo.edu/>. The navigation menu includes 'About', 'Browse', 'Images', and 'Download'. The main heading is 'MARCO', where the 'M' is a teal circuit-like shape and the 'O' is a circular image of a protein crystal. Below the heading is the text: 'MAchine Recognition of Crystallization Outcomes. This effort aims to collect a large collection of representative images of protein crystallization cocktails along with their metadata, and to share them with image analysis experts beyond the crystallography community.' A teal 'Browse' button is positioned below the text. At the bottom, a footer states: 'MARCO is a multi-institutional collaboration. Data hosted by The Center for Computational Research'.



Automated Protein Crystal Detection

Project Description

Objective: Develop an automated system to acquire and identify images of protein crystals

Background: Crystallographers look through individual pictures of crystallization drops to identify protein crystals. Manual review is time consuming and sometimes difficult to identify a protein crystal from other contaminants such as precipitate, debris, etc. An automated system could save time and potentially identify 'hard to find' crystals

In the future, use other biophysical measurements like UV/VIS or SONICC system from Formulatrix to accelerate learning and identification of crystals

Assets available: database of protein crystallization experiments and images (not annotated)



Automated Protein Crystal Detection

MARCO Initiative: publicly available assets

Images including training and test sets (~6GB)

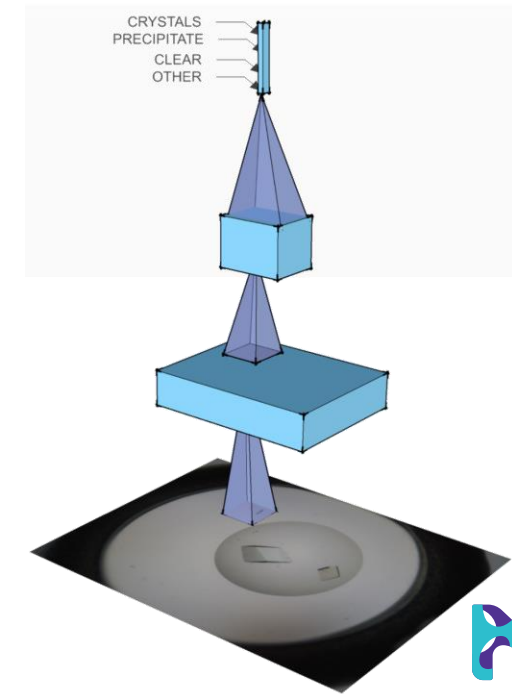


Institution	Technical Setup	# of Images
Bristol-Myers Squibb	Formulatrix Rock Imager (FRI)	8719
CSIRO	Sitting drop, FRI, Rigaku Minstrel [23, 24]	15933
HWMRI	Under oil, Home system [15]	79632
GlaxoSmithKline	Sitting drop, FRI	83126
Merck	Sitting drop, FRI	305804

Github repository for machine learning algorithms (TensorFlow)



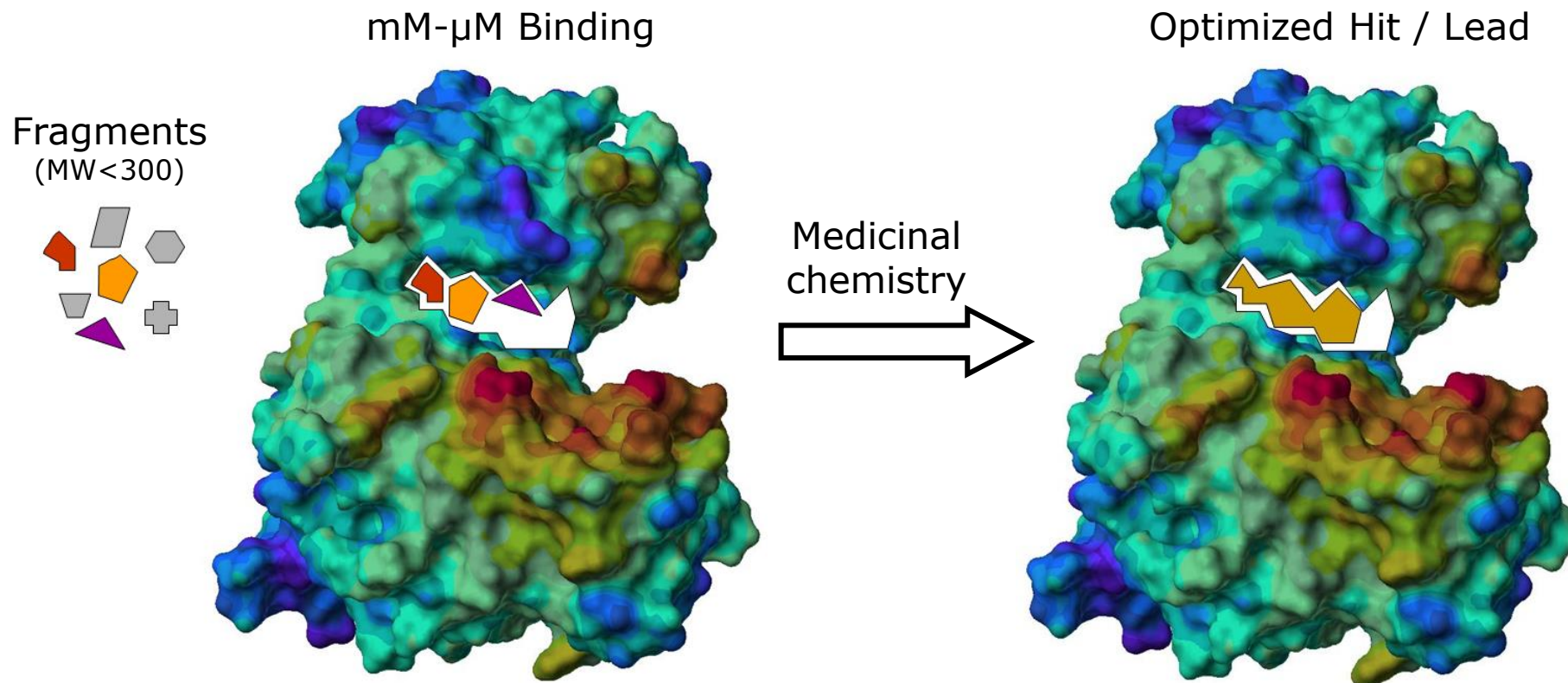
The screenshot shows the GitHub repository page for `tensorflow/models/research/marco`. The repository is owned by `vincentvanhoucke` and has 2,435 watches, 37,543 stars, and 21,908 forks. The latest commit is `a69f08a` on April 30. The repository contains files like `README.md`, `jpeg2json.py`, and `request.json`. The `README.md` file is open, showing the title "Automating the Evaluation of Crystallization Experiments" and a description of a pretrained model for classifying crystallization outcomes using deep convolutional neural networks. Below the text is a circular image showing a crystallization experiment in a well.



Collection of Drug Discovery Examples

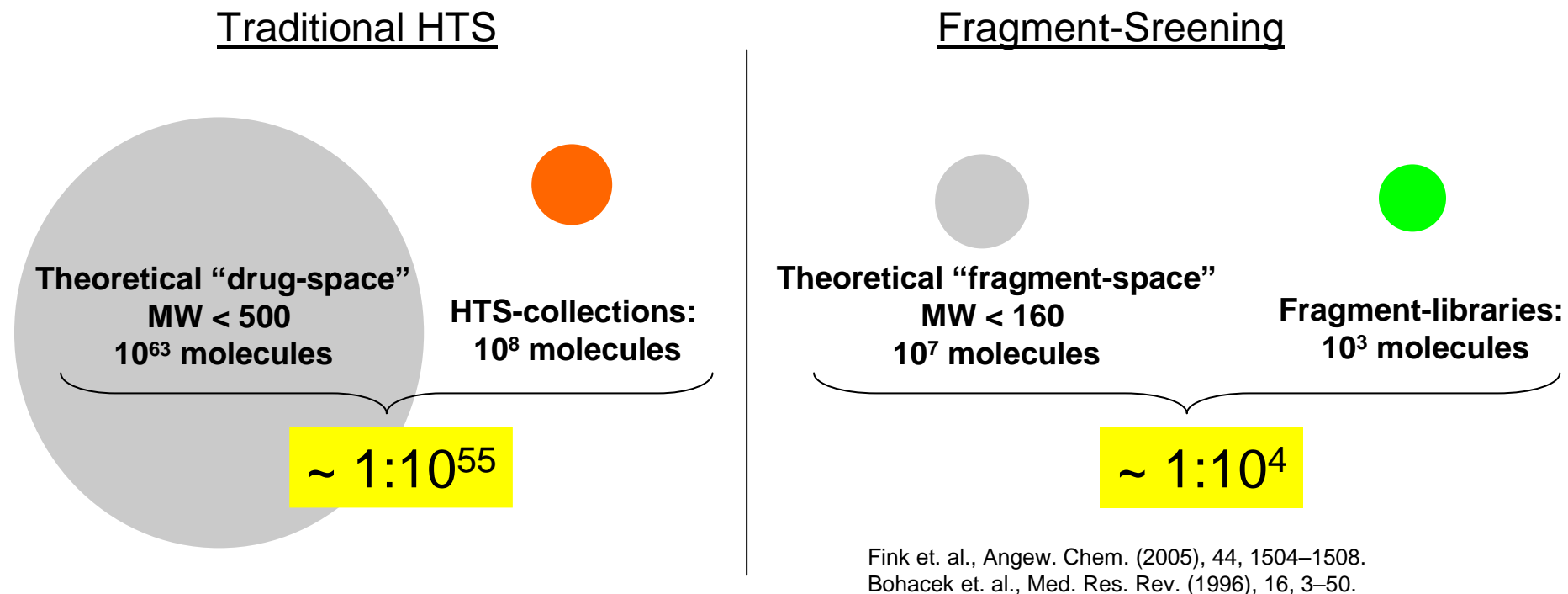
- Fragment Screening and Crystallization
- Tyrosine Spleen Kinase to look for Water Molecules
- Flexibility assessed in the structural model HSP90

Fragment-based Lead Discovery (FBLD) Concept



Low complexity fragments with higher probability to match binding site

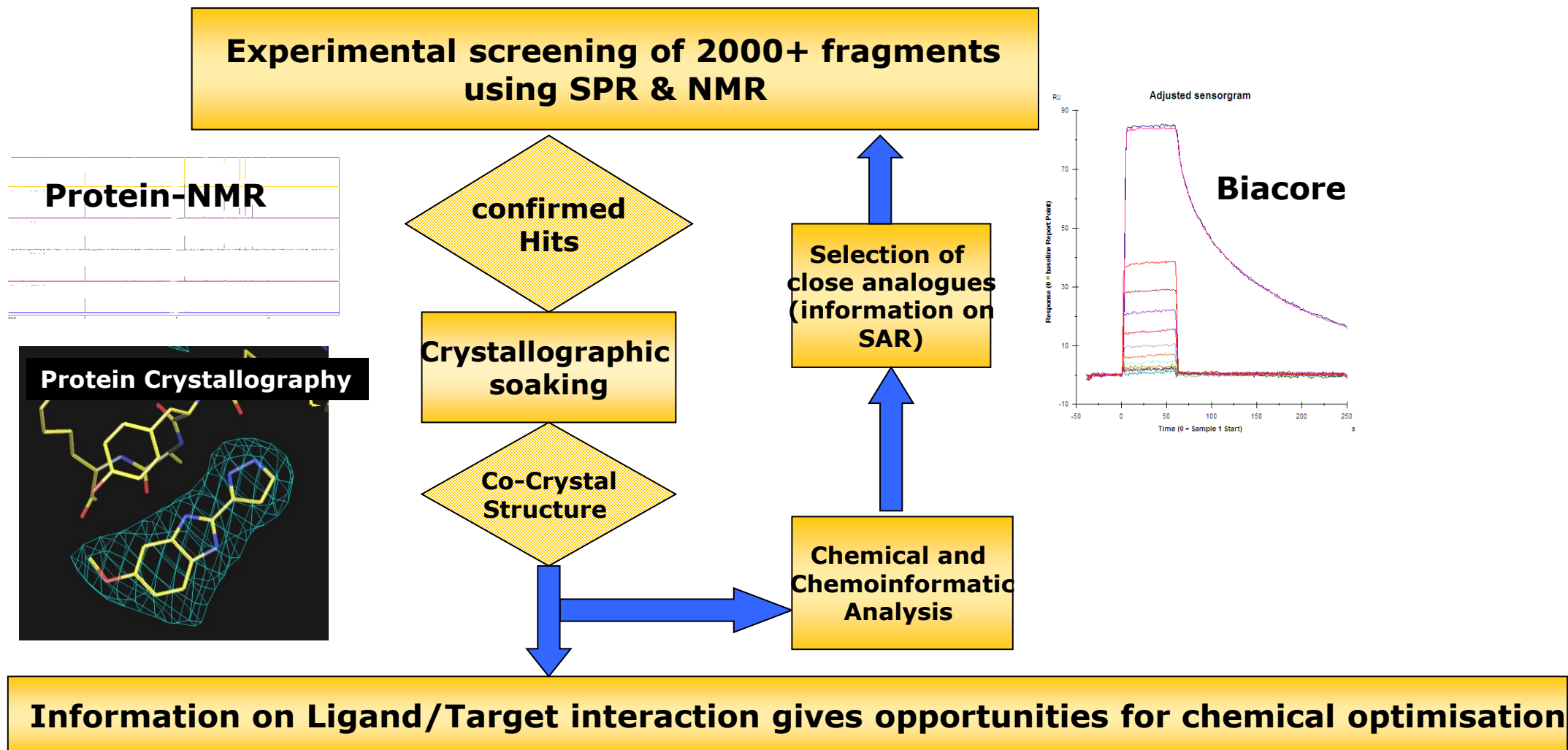
Diversity of Fragments



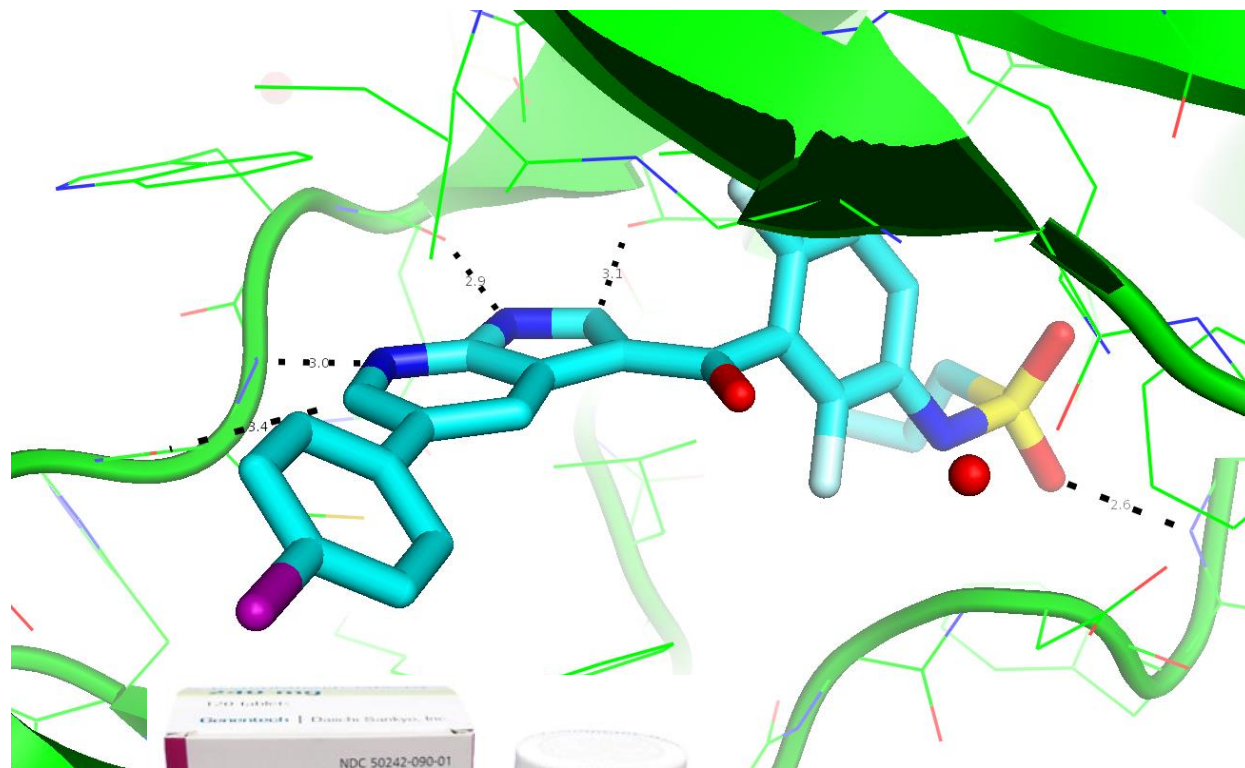
Fragment libraries sample higher chemical diversity

=> Significantly fewer compounds to be screened at higher concentrations

Fragment Based Lead Discovery-Process

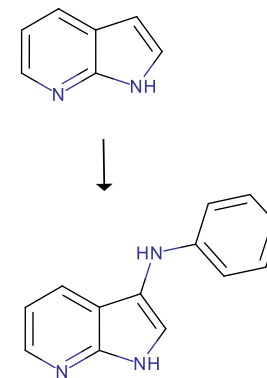


First approved drug from Fragment screening



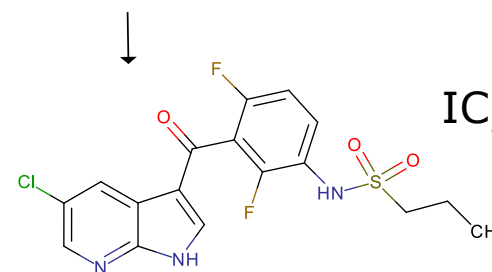
FDA approval 2011
 ←
 metastatic melanoma

February 2005
 (Plexxikon)



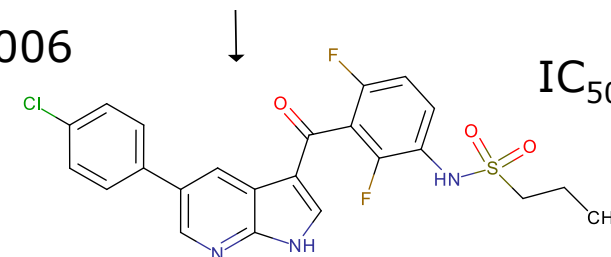
B-Raf V600E
 $IC_{50} > 200 \mu M$

$IC_{50} \sim 100 \mu M$



$IC_{50} = 0.013 \mu M$

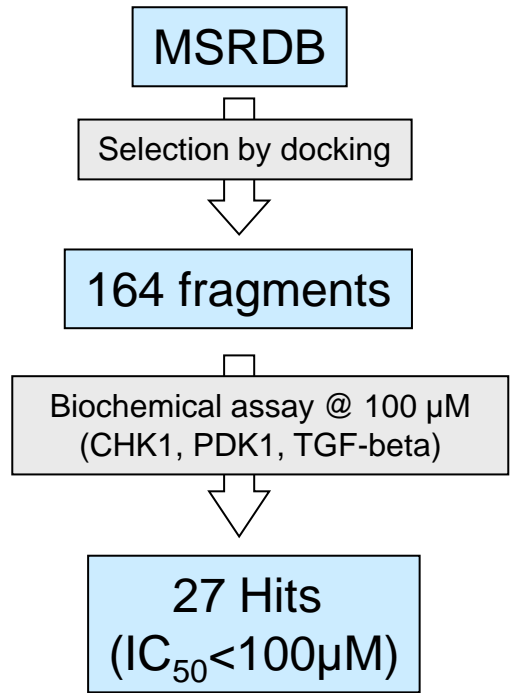
January 2006
 PLX4032
 (Zelboraf)



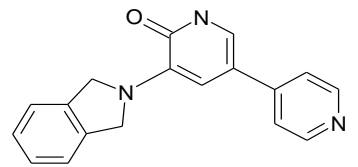
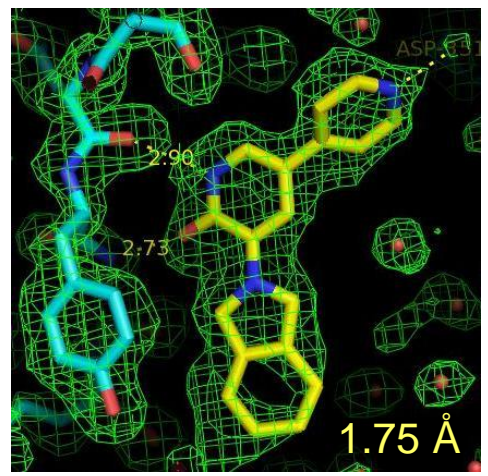
$IC_{50} = 0.031 \mu M$



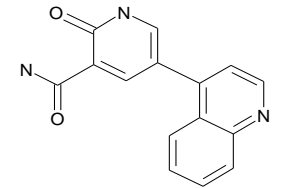
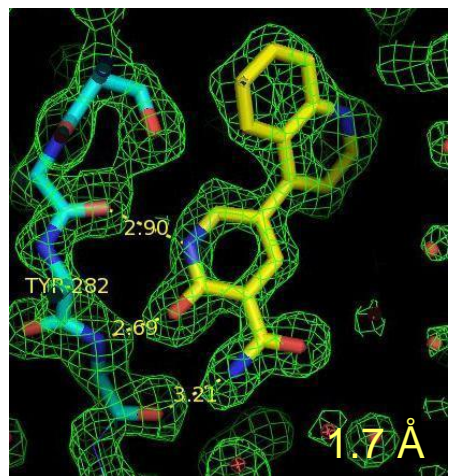
Previous results of in-house FBLD: Example in TGF-beta



X-ray structures of fragments in TGF-beta

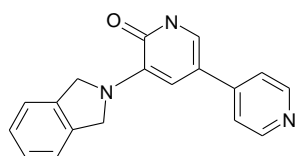
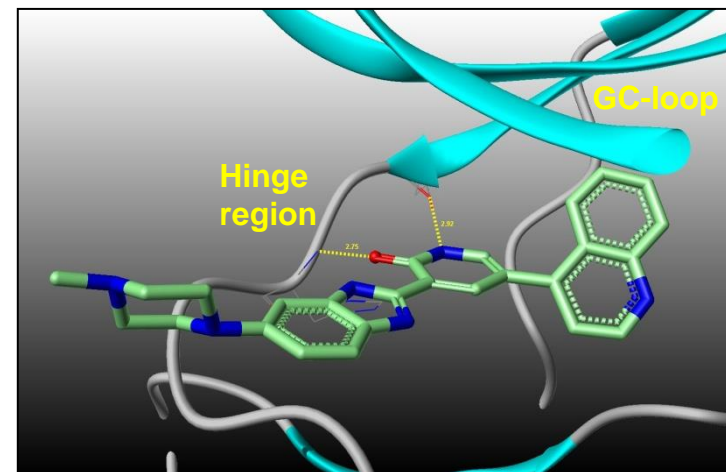
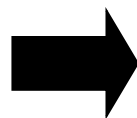
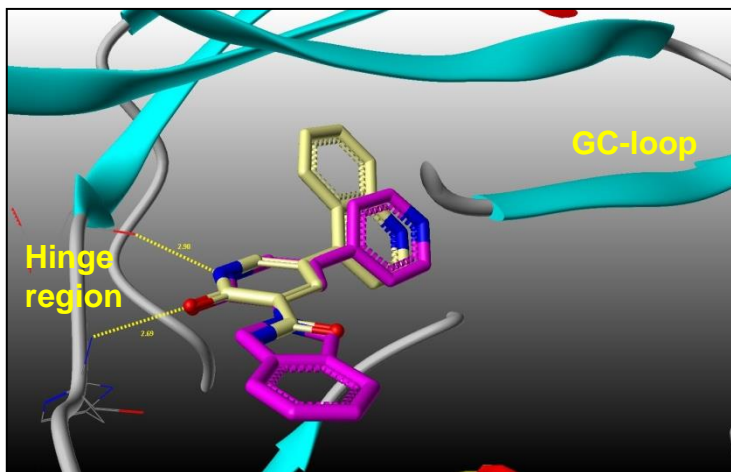


MSC1043364A
TGF-beta: **IC₅₀=49 μM**
CHK1: IC₅₀=6.7 μM
PDK1: IC₅₀=35 μM

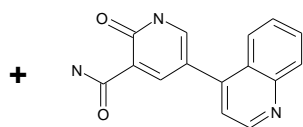


MSC1044909A
TGF-beta: **IC₅₀=48 μM**
CHK1: 92%cntrl@100 μM
PDK1: 86%cntrl@100 μM

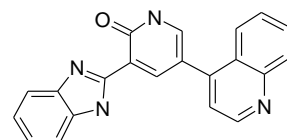
Optimization of fragments for TGF-beta



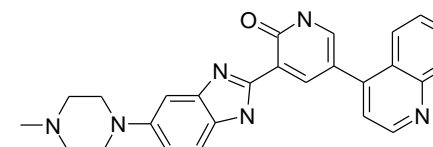
IC₅₀= 49 μM



IC₅₀= 48 μM



IC₅₀= 370 nM

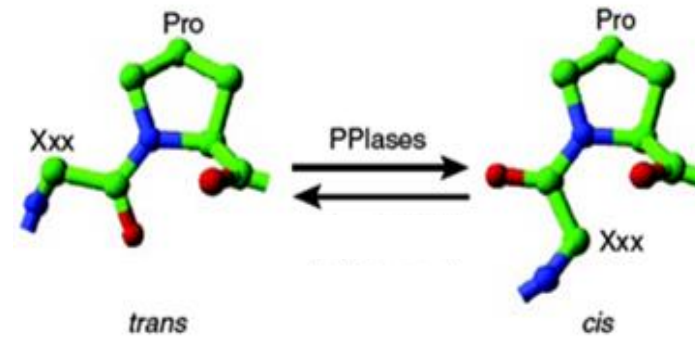
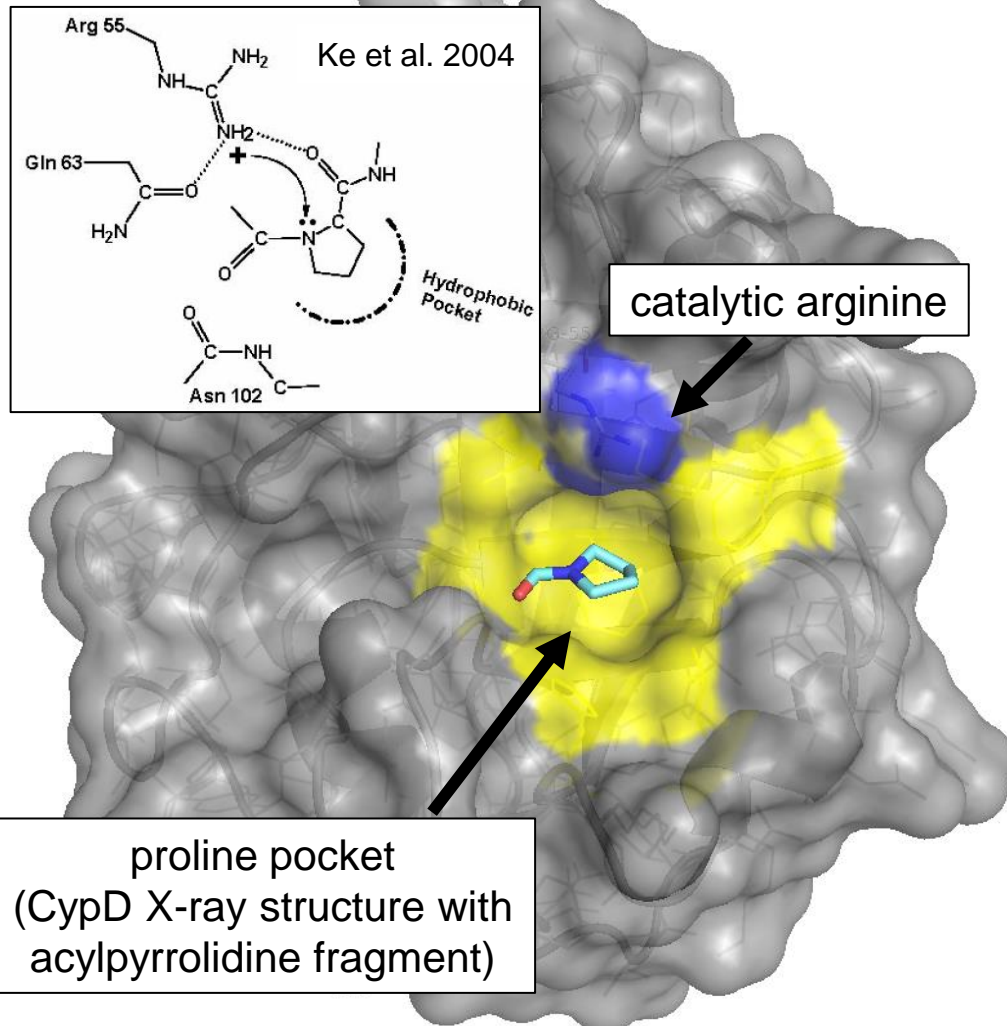


IC₅₀= 37 nM

Structure-based optimization

- Favourable IP-situation
- Promising selectivity profile
- Weak cellular activity

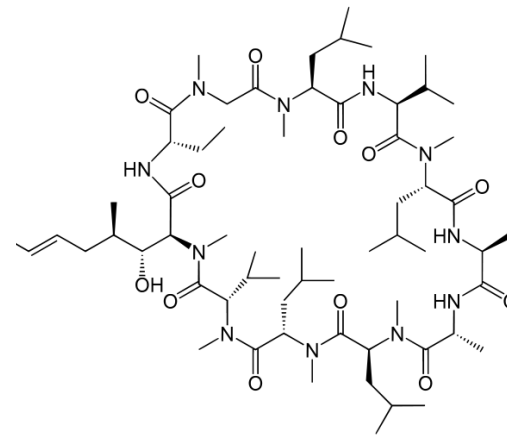
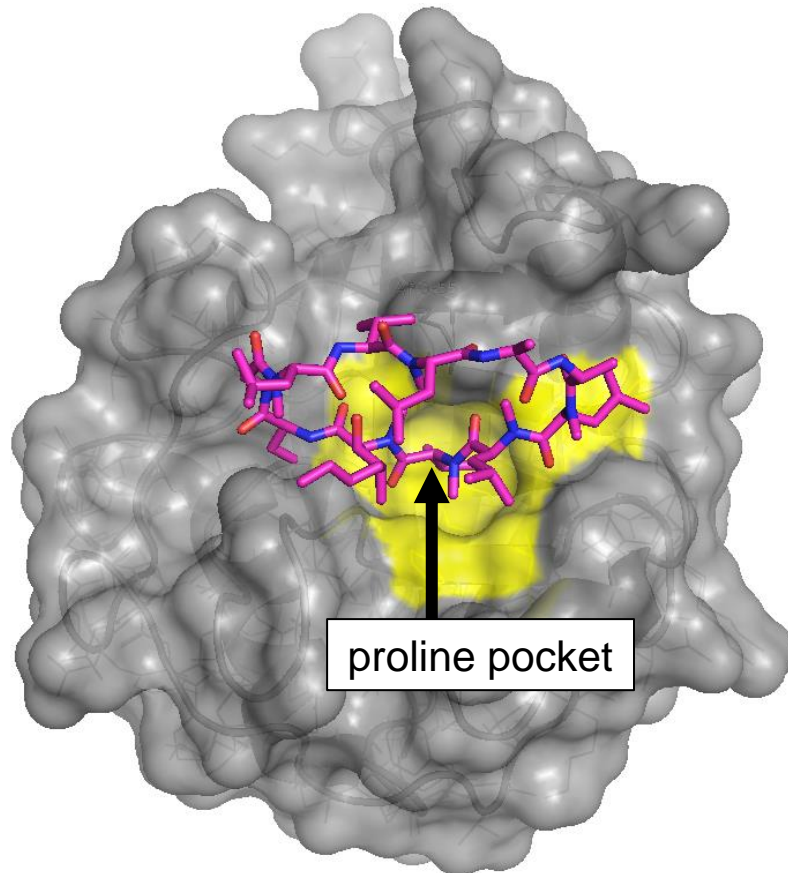
Cyclophilin D enzymatic mechanism



- Cyclophilins catalyze cis-trans isomerization of prolines
- Proline bound in small lipophilic pocket
- Conserved arginine involved in isomerization mechanism

Cyclophilin D inhibition by Cyclosporin A

Crystal structure of Cyclophilin D in complex with Cyclosporin A



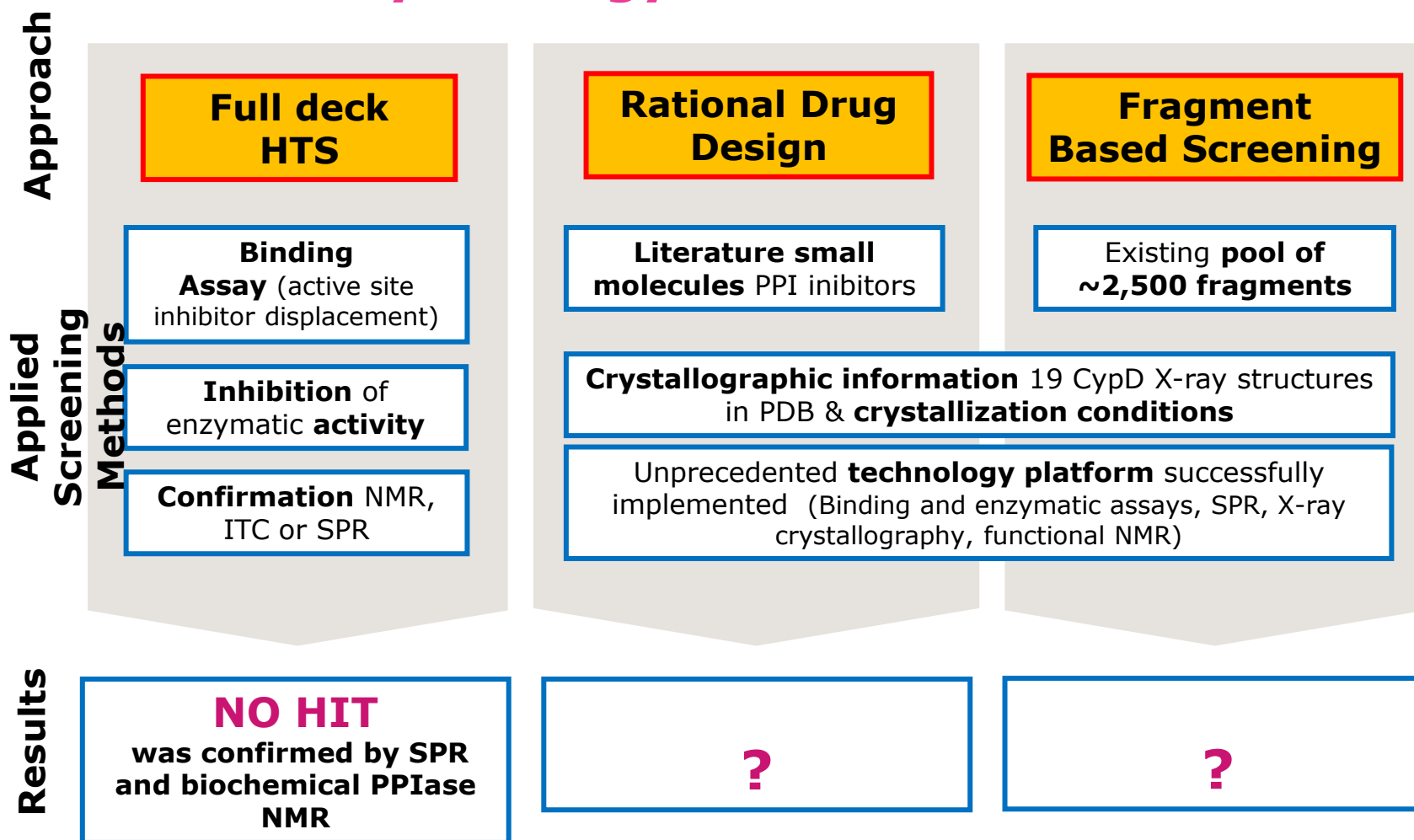
Cyclosporin A

SPR : $K_D = 30 \text{ nM}$

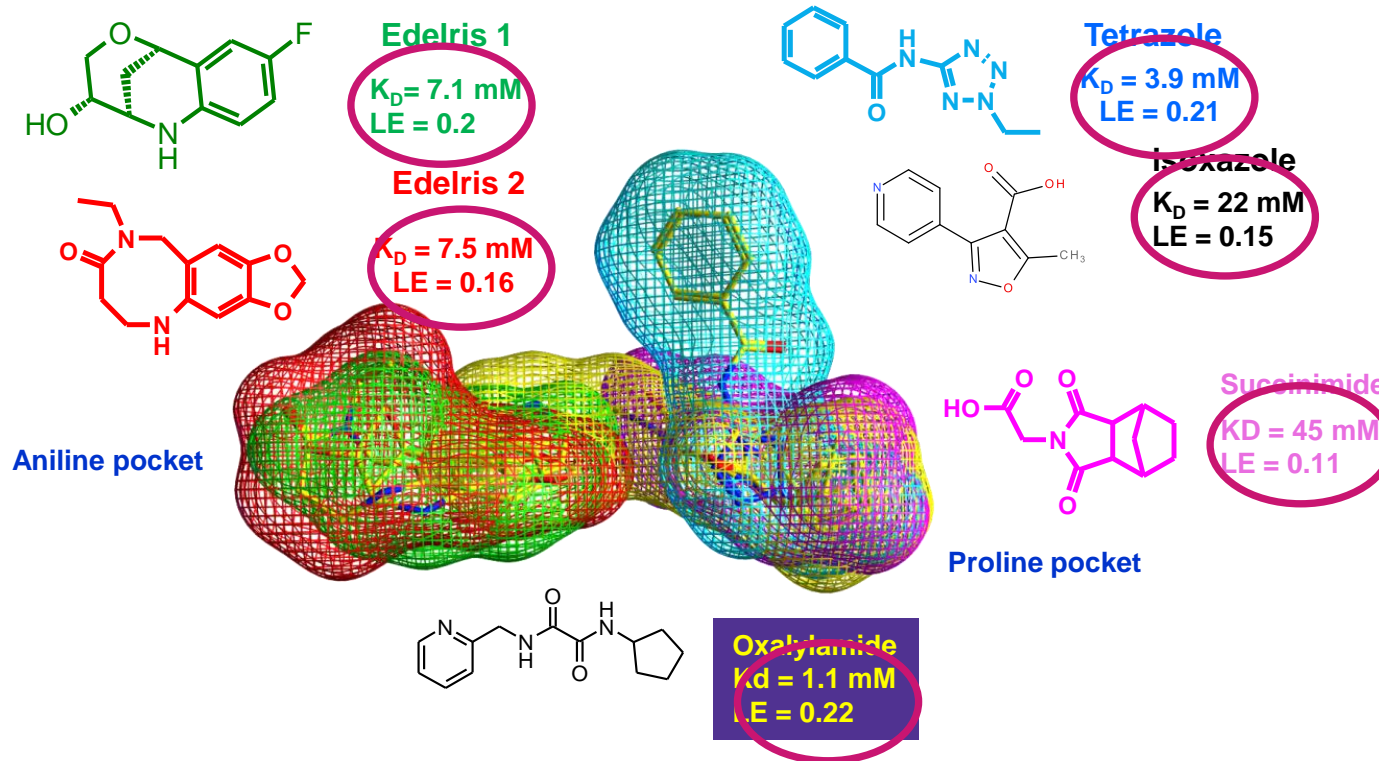
Binding : $IC_{50} = 20 \text{ nM}$

- Immunosuppressant drug Cyclosporin A (CsA) inhibits cyclophilin family members
- CsA binding encompasses large contact area ($\sim 150 \text{ \AA}^2$) including proline pocket
- CsA binding site highly conserved among cyclophilins

Hit Discovery Strategy : Three Tracks in Parallel



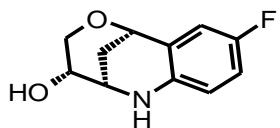
Solved PPIase Fragment Structures Occupy optimal Space for Growing and Linking Approaches



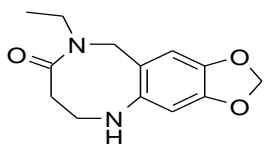
Cyclophilin D: in-house FBLD application

From millimolar fragments to 3 nanomolar series

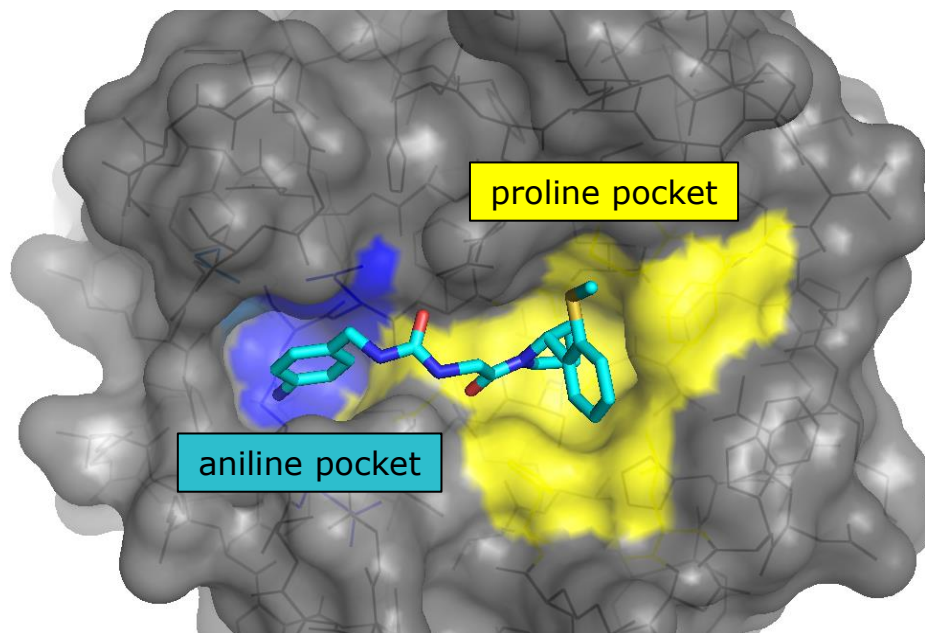
fragments in aniline pocket



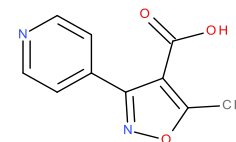
$K_D = 7.1 \text{ mM}$
 $LE = 0.2$



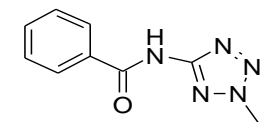
$K_D = 7.5 \text{ mM}$
 $LE = 0.16$



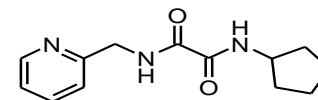
fragments in proline pocket



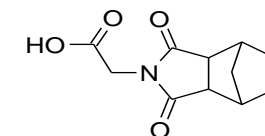
$K_D = 22 \text{ mM}$
 $LE = 0.15$



$K_D = 3.9 \text{ mM}$
 $LE = 0.21$



$K_D = 1.1 \text{ mM}$
 $LE = 0.22$

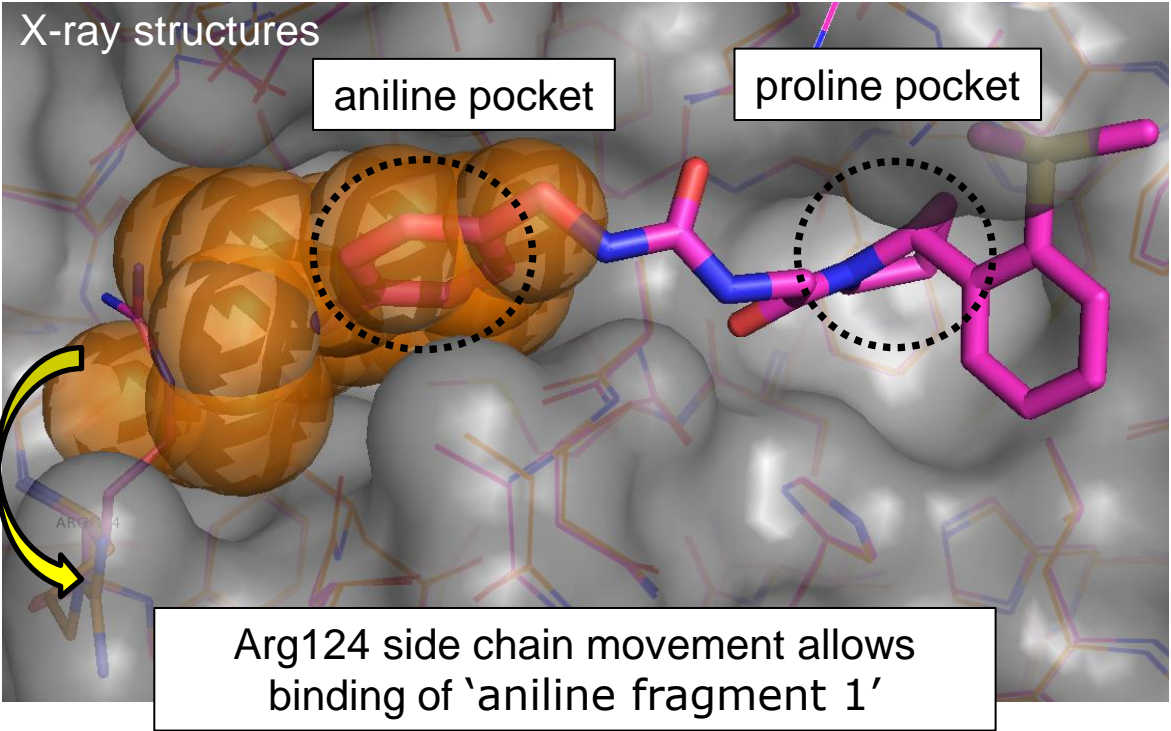


$K_D = 45 \text{ mM}$
 $LE = 0.11$

- HTS yielded no confirmed hit
- Fragment-screen by SPR identified 58 hits, but only with millimolar potencies (K_D s 1-58 mM)
- X-ray structures of 6 fragments served as basis for merging and linking to yield 3 nanomolar series

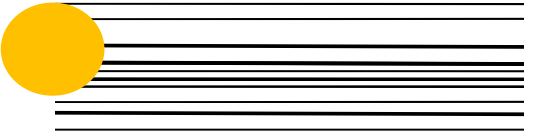
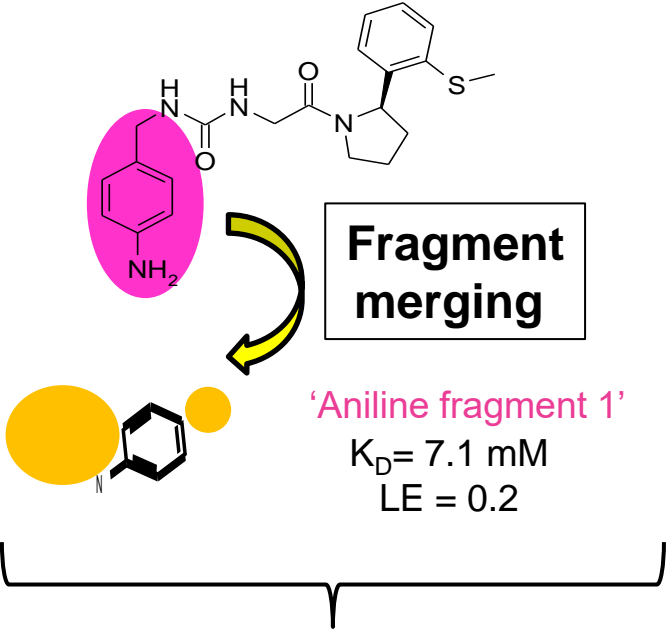
The Power of Biophysical Methods:

Fragment merging with 'Aniline fragment 1'



➤ 26-fold potency enhancement ($K_D = 204 \text{ nM} \rightarrow 7.7 \text{ nM}$) achieved through replacement of 'simple' aniline by 'aniline fragment 1'

CypD reference inhibitor
SPR : $K_D = 204 \text{ nM}$
Binding : $IC_{50} = 520 \text{ nM}$

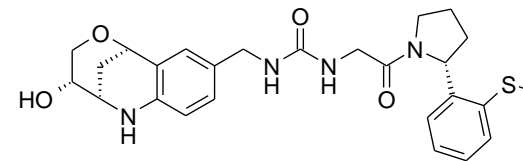


SPR : $K_D = 7.7 \text{ nM}$
Binding : $IC_{50} = 3.7 \text{ nM}$



Medicinal Chemistry – Series 1

General profile

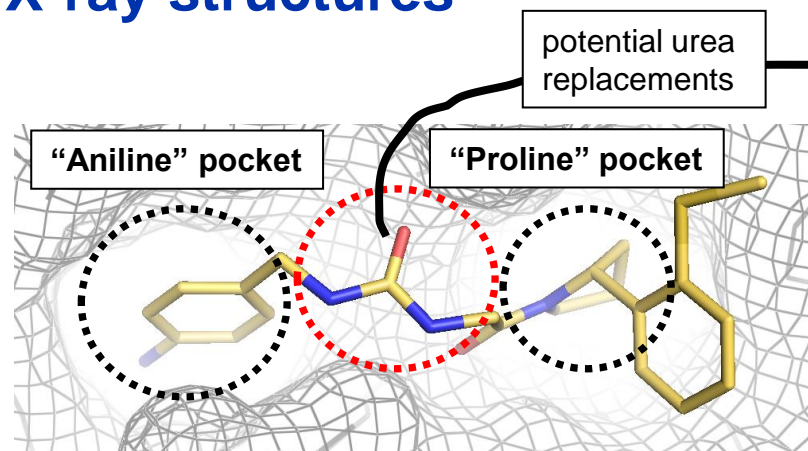
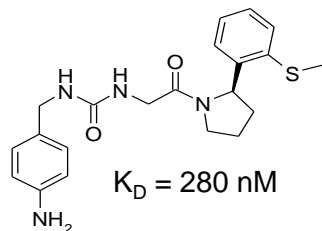


CsA	PhysChem/ <i>in vitro</i> Pharmacology		DMPK / Safety	
1202/ 3.8	MW / logP	496 / 1.8	Stability in PBS / SGF	Yes / No
235 / 5	tPSA / HBD	103 / 4	Stability in plasma (h, r, m)	Yes
	CNS-MPO score	3	u-somes stab. (h, m, r)	78/ 579 / 16
0.02	Binding (competition) IC ₅₀ uM	0.031	SPB (h, m, h)	og
0.03	Binding (SPR) KD uM	0.0077	Caco-2 (Papp / E)	0.02 / 564
0.04	PPI ase activity IC ₅₀ uM	0.0037	MDR1/MDCK	0.23 / 5
Yes	PPIase activity (NMR)	Yes	CYP inhibition	> 10 uM
NA	Kinetic Solubility PBS uM	> 200	HTS-MNT	pNegative
EC ₅₀ = 3.5 uM	Rat primary cortical neuron viability assay	40% effect @ 100 uM	hERG (binding)	> 30 uM

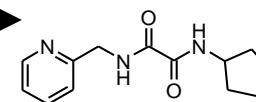
- ~100 molecules synthesized, **nM potency** achieved
- Optimisation of **permeability** needed by reducing Mw/ PSA and HBD, no safety flag

6 CypD fragment X-ray structures

Reference inhibitor

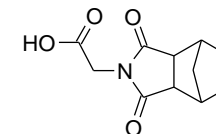


Oxalylamide



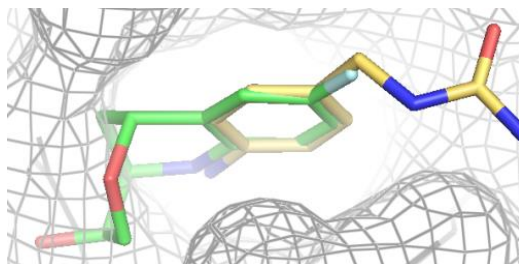
$K_D = 1.1 \text{ mM}$
LE = 0.22

Succinimide

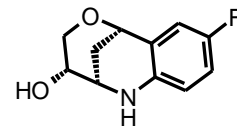


$K_D = 45 \text{ mM}$
LE = 0.11

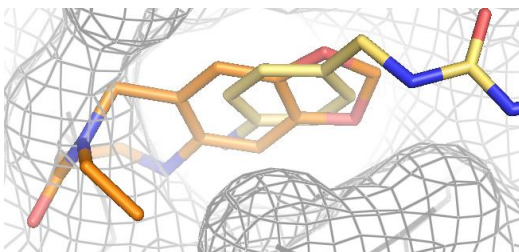
Fragments binding in **"Aniline" pocket**



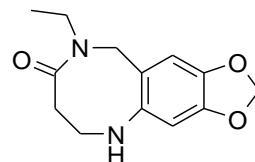
"Aniline fragment" 1



$K_D = 7.1 \text{ mM}$
LE = 0.2

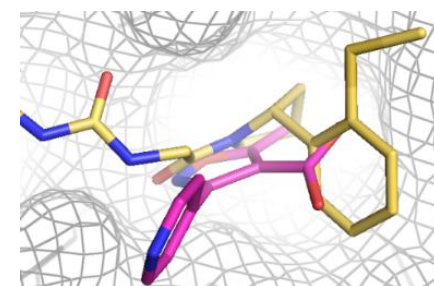


"Aniline fragment" 2

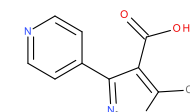


$K_D = 7.5 \text{ mM}$
LE = 0.16

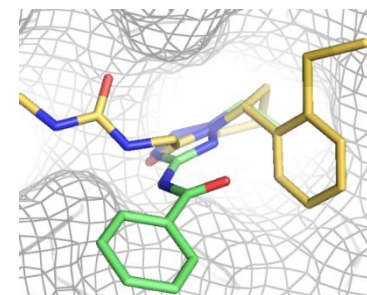
Fragments binding in **"Proline" pocket**



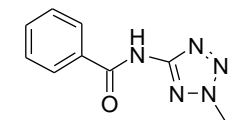
Isoxazoles



$K_D = 22 \text{ mM}$
LE = 0.15



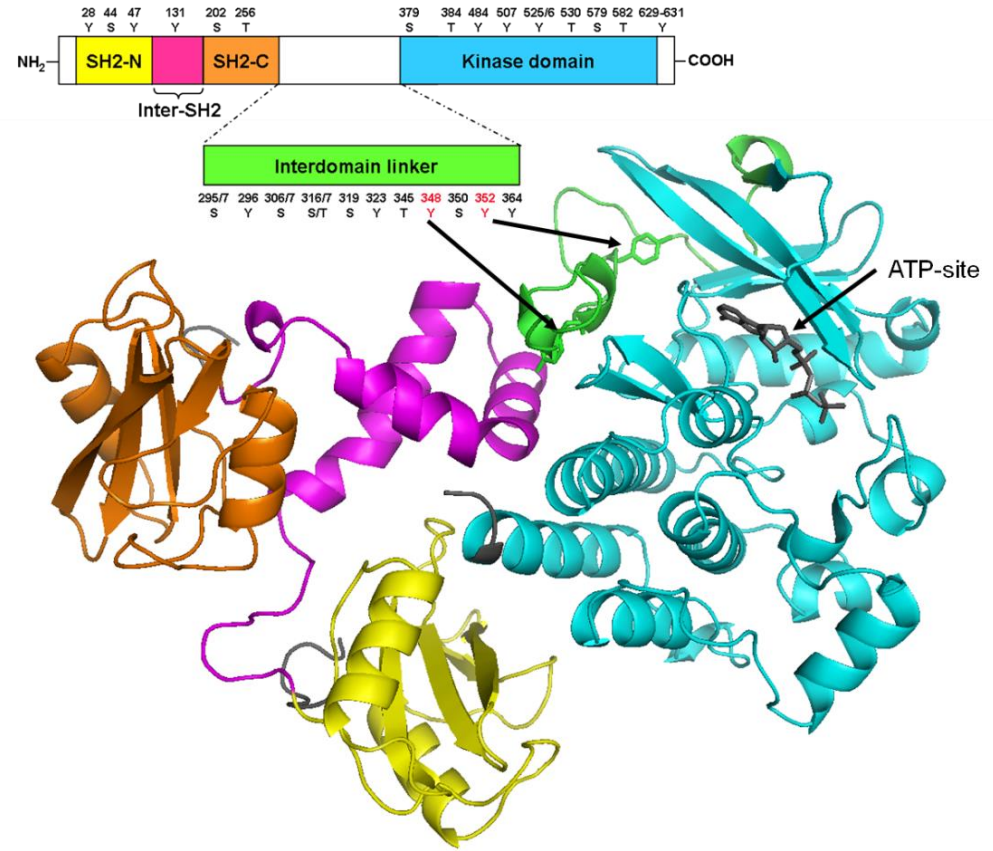
Tetrazoles



$K_D = 3.9 \text{ mM}$
LE = 0.21

Protein Crystallography: Spleen Tyrosine Kinase SYK

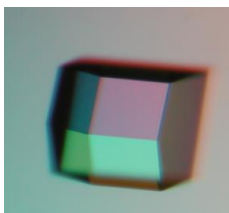
Domain-model and proposed phosphorylation sites of SYK
→ Y348 and Y352 play a crucial role
→ in the activation mechanism of SYK



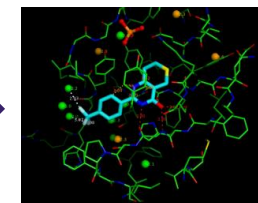
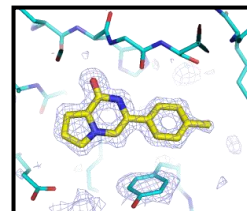
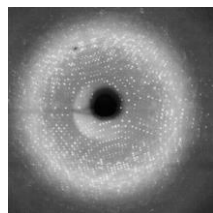
Structure

Deposition & Analysis

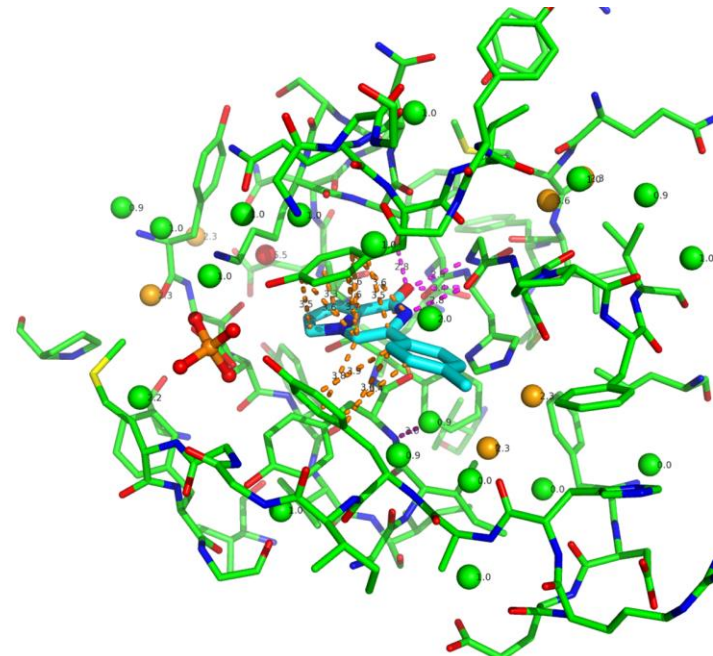
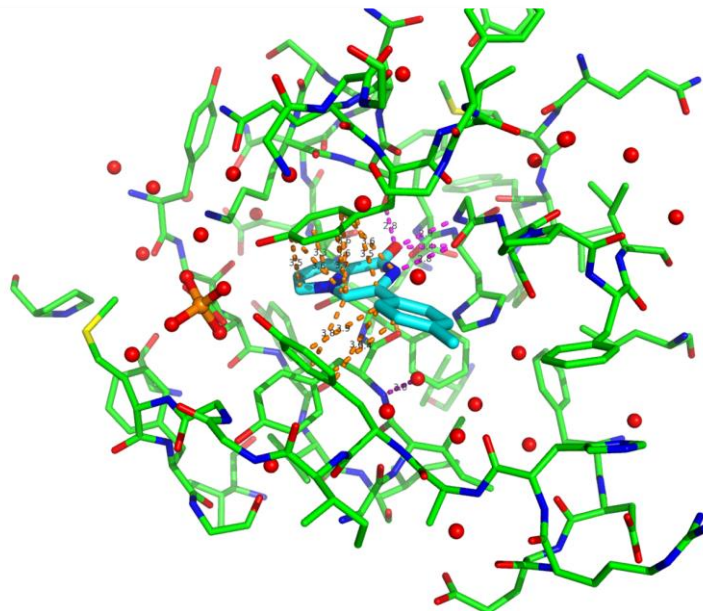
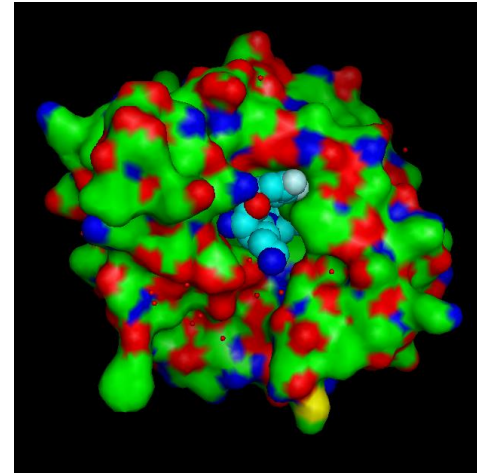
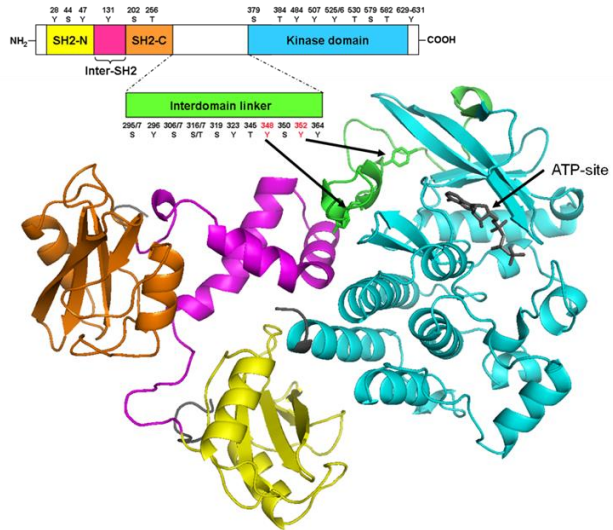
Crystal



Diffraction

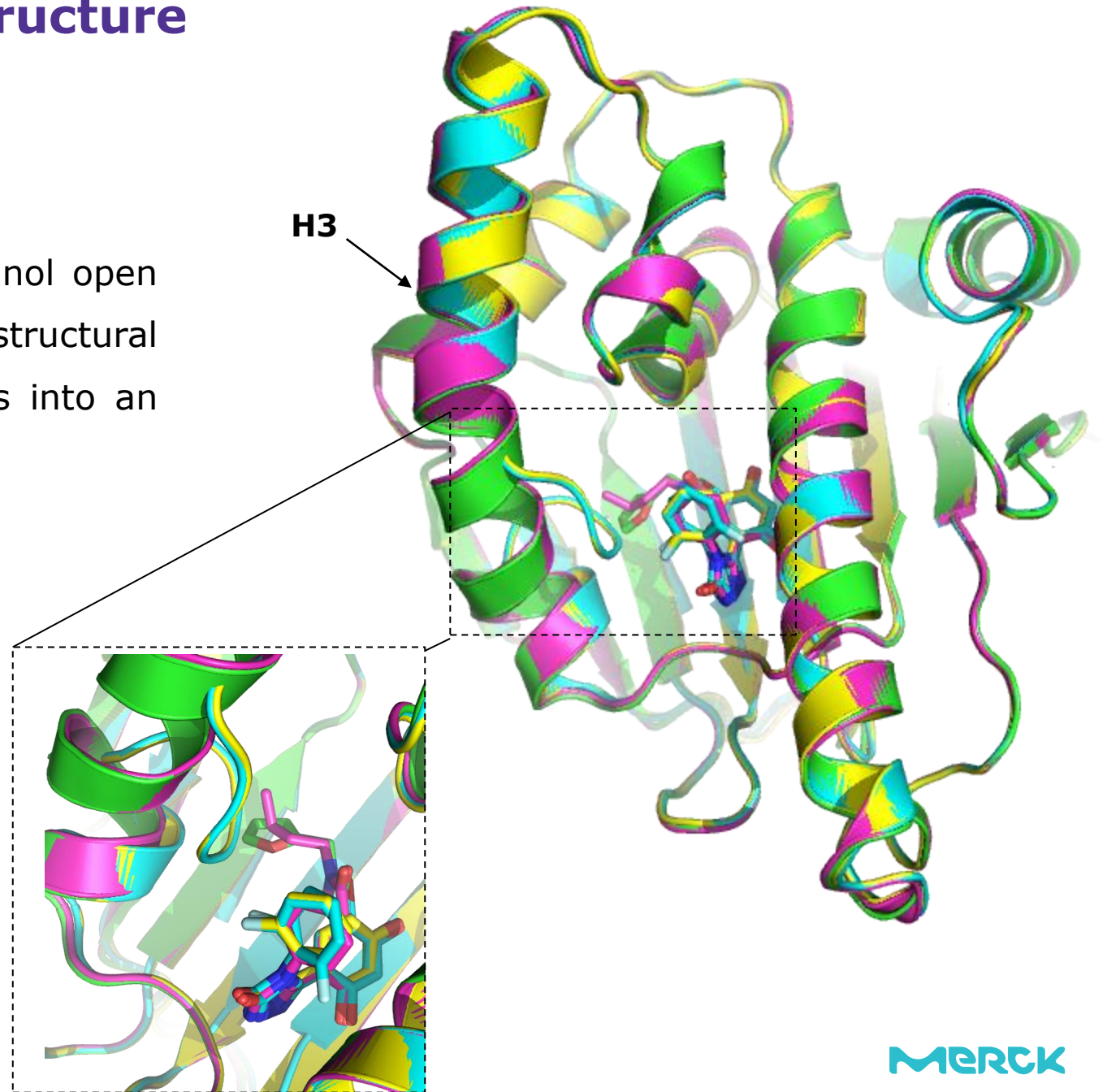
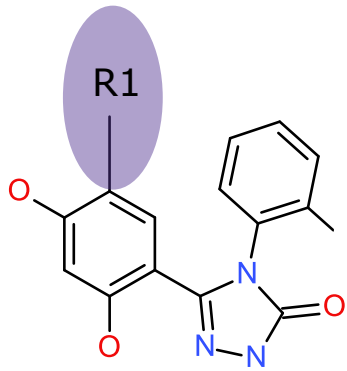


„Classification of Water Molecules “

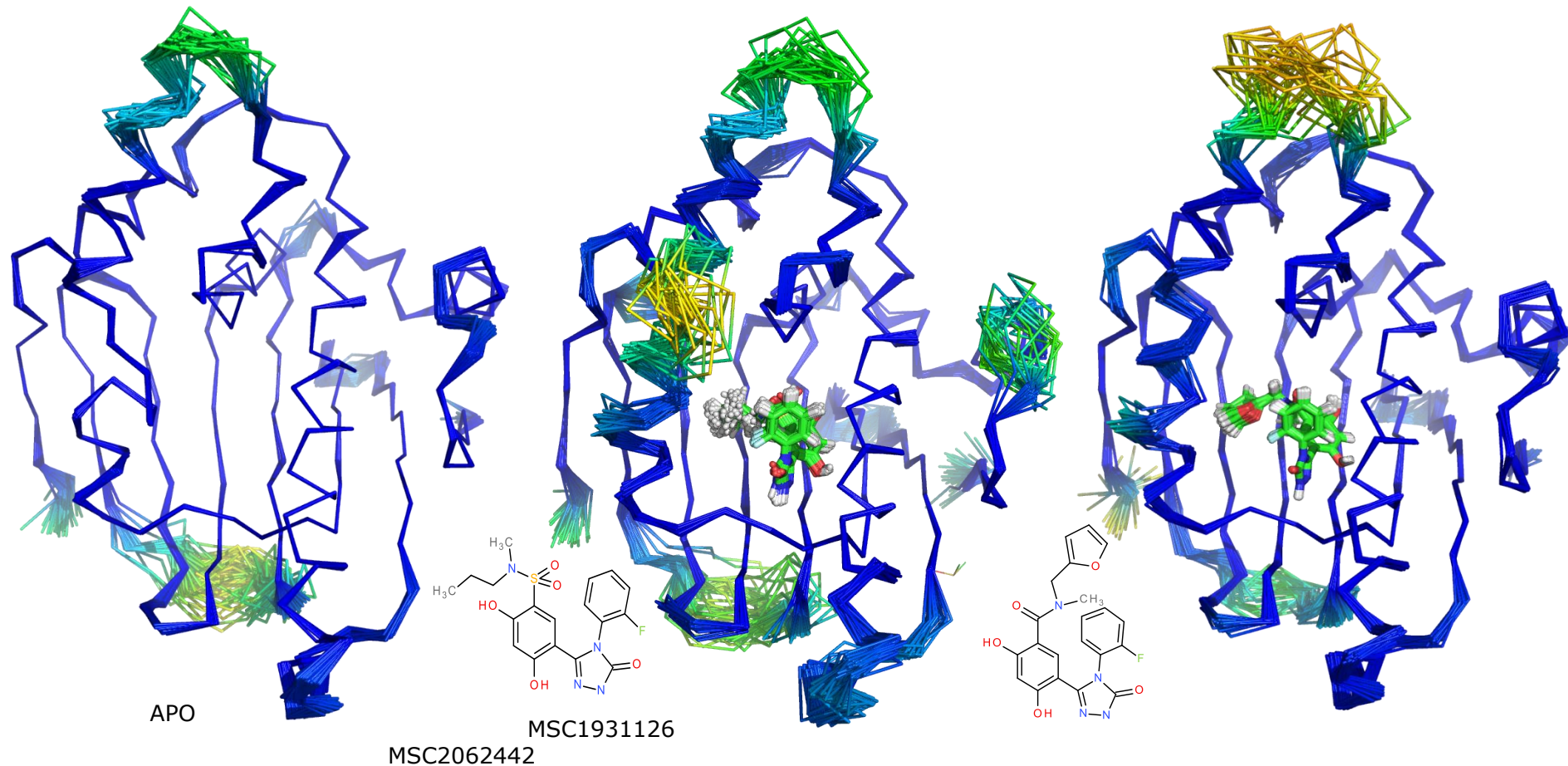


Structural analysis of HSP90 structure complexes

Substituents in the 5' position of the resorcinol open up a large lipophilic pocket by enforcing a structural change so that segment 103-110 rearranges into an helical conformation

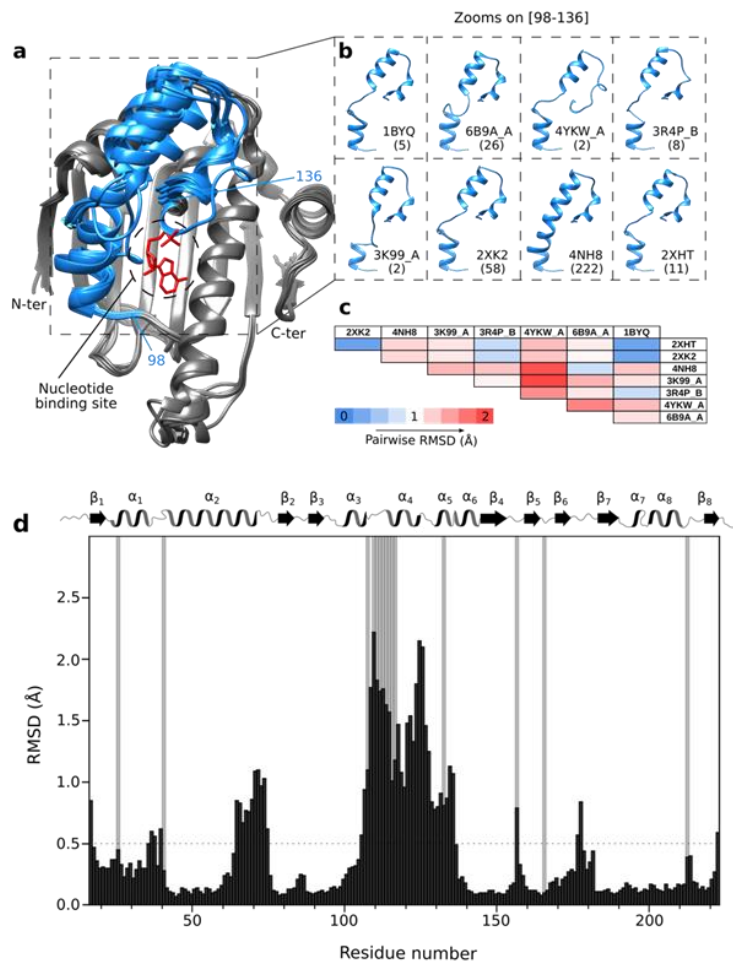


Modelling Dynamics in Protein Crystal Structures by Ensemble Refinement



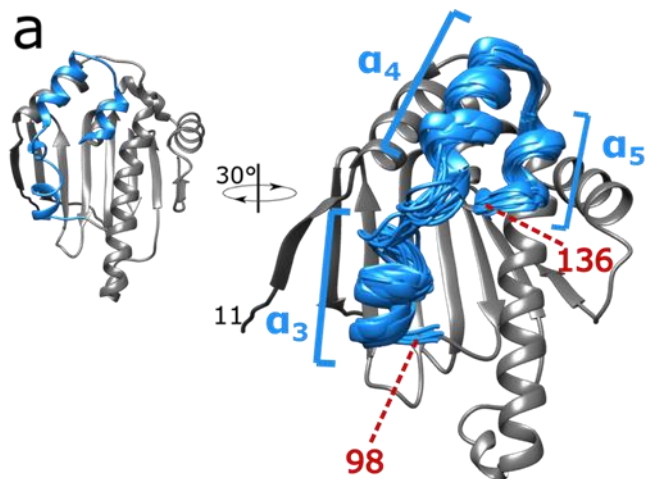
- ❑ Residues 103-110 in the Apo structure are significantly more stable when compared to complex structures that induce helix formation.
- ❑ Helix stability is affected by the chemistry of the ligand.

Analysis of available X-ray structures of human HSP90 N-terminal domain.



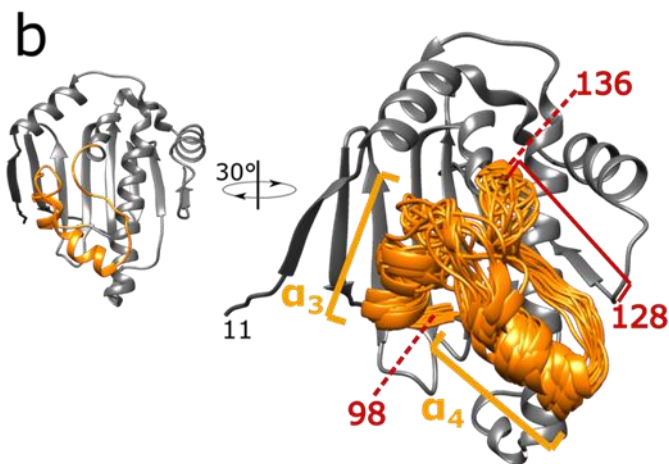
Superimposition of 8 centroids representing the 8 clusters describing the 334 structures of isolated HSP90-NTD available in the Protein Data Bank (on January the 5th of 2021).

NMR Solution structure ensembles of HSP90 α -NTD ATP-lid open and closed states.



The HSP90 ATP-lid populates a closed conformation distant by up to 30 Å from the previously known open ATP-lid state.

Both structures could be solved and kinetic and thermodynamic parameters could be derived.



Biochemical mechanism of new molecular entities approved during 2001 and 2004

During 2001 and 2004 the FDA approved 85 new molecular entities.

Majority targeted enzymes (48%) or GPCRs (33%),

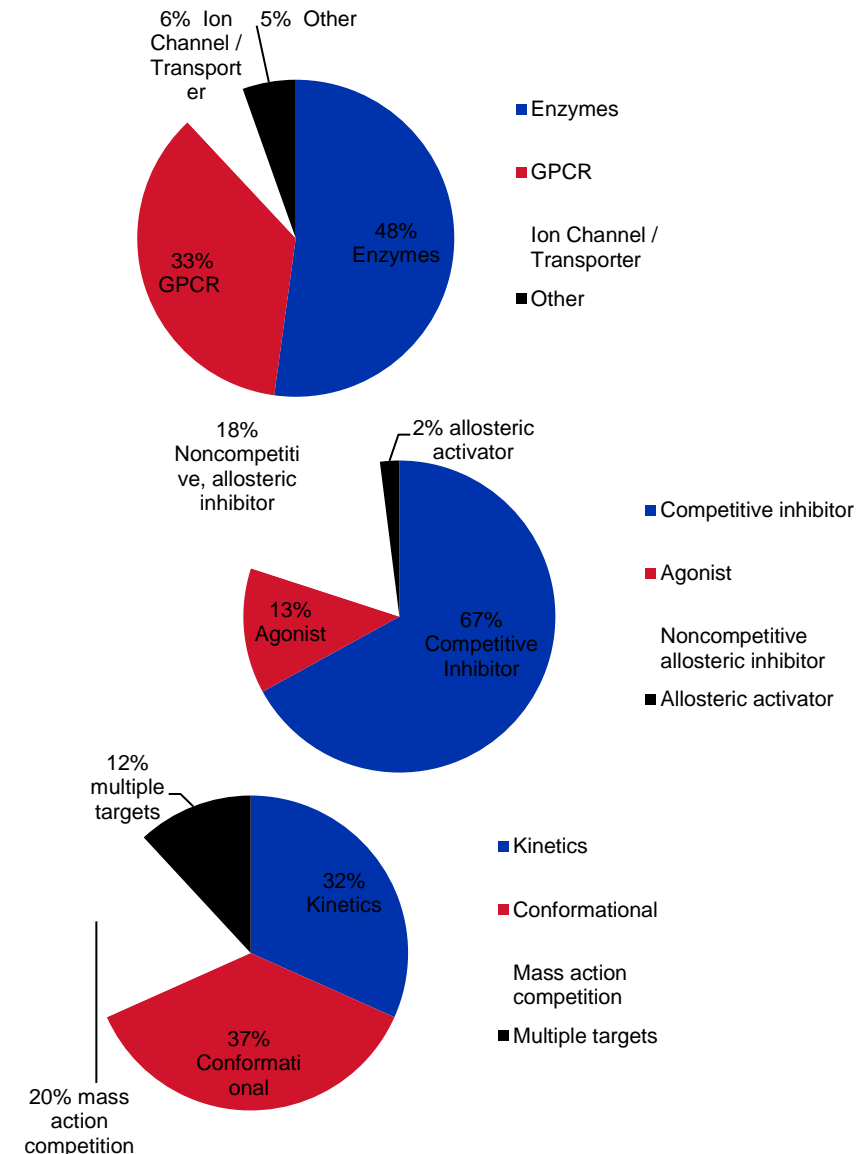
80% interacted with the same site as endogenous effectors

Three biochemical operations defined the modes of action

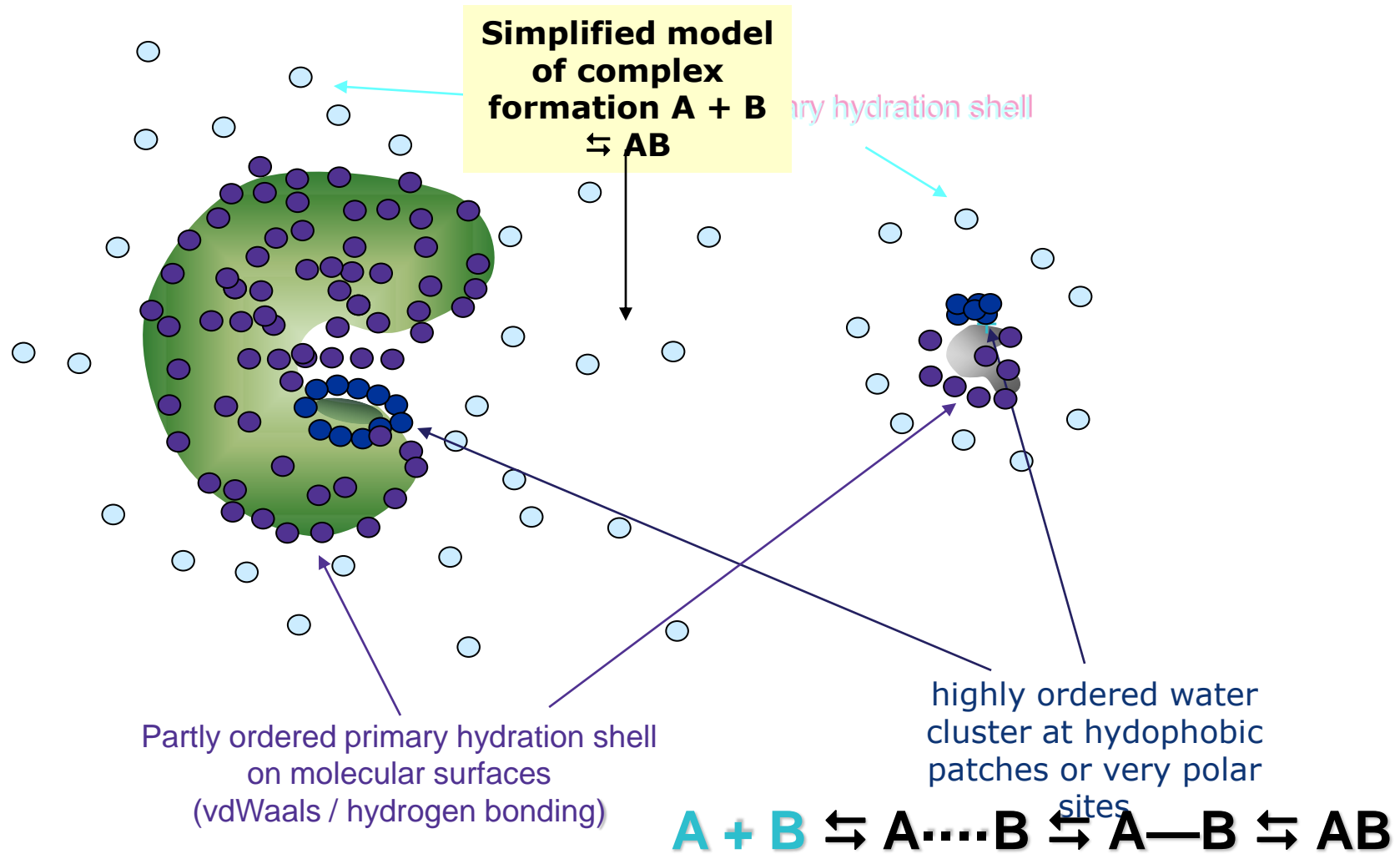
- 1) Mass action competition
- 2) Drug stabilized conformational change important to the response
- 3) Drug action is less-responsive to mass action competition with effectors due to non-equilibrium kinetics

About 80% of the NMEs elicit a response utilizing conformational and / or non-equilibrium kinetics mechanisms

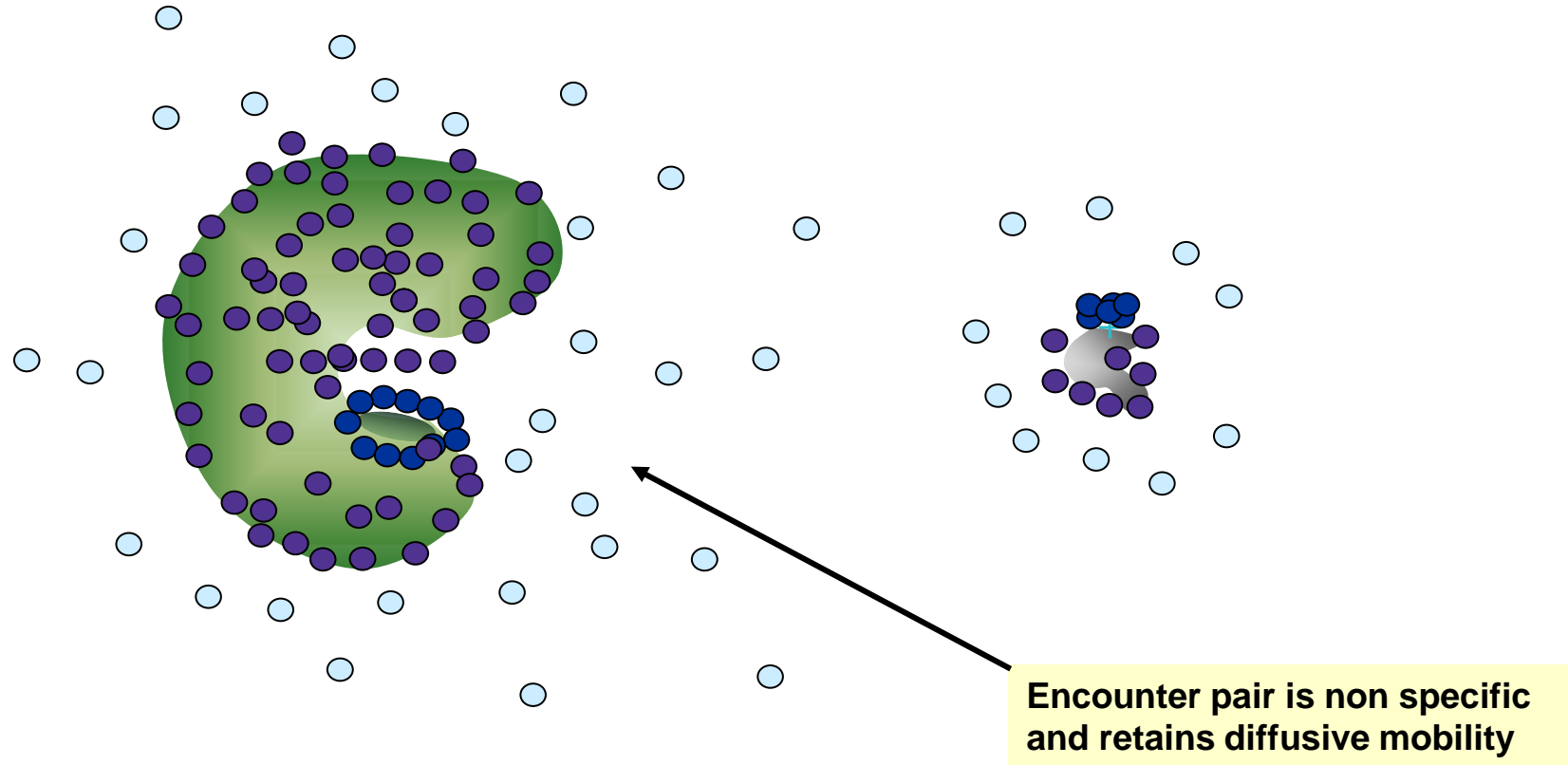
Swinney Current Topics in Med. Chem. 2006, 6, 461-478, more recent Swinney focus on mechanism of new drugs



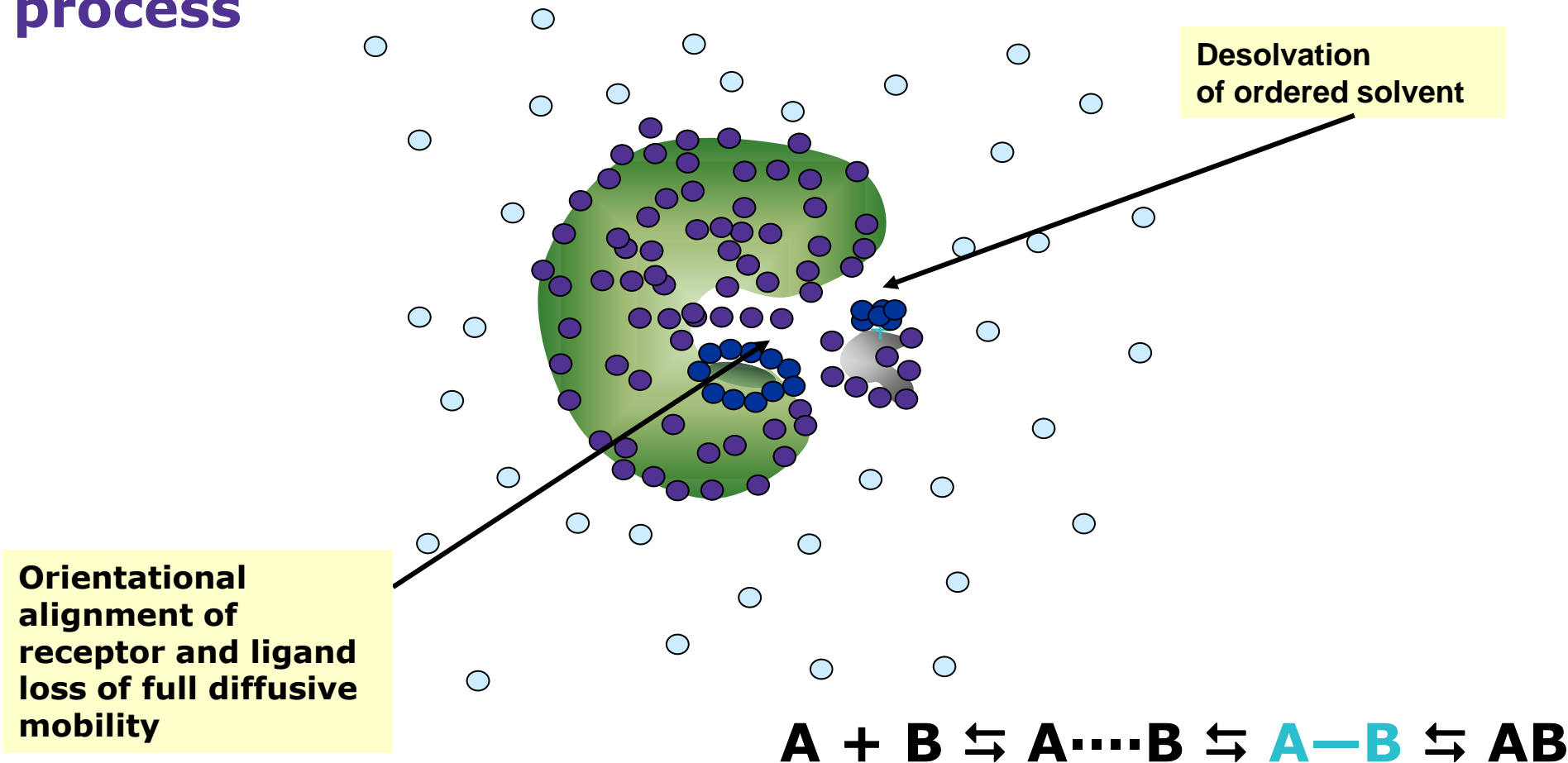
...binding is not only a two players game



...it involves numerous molecules



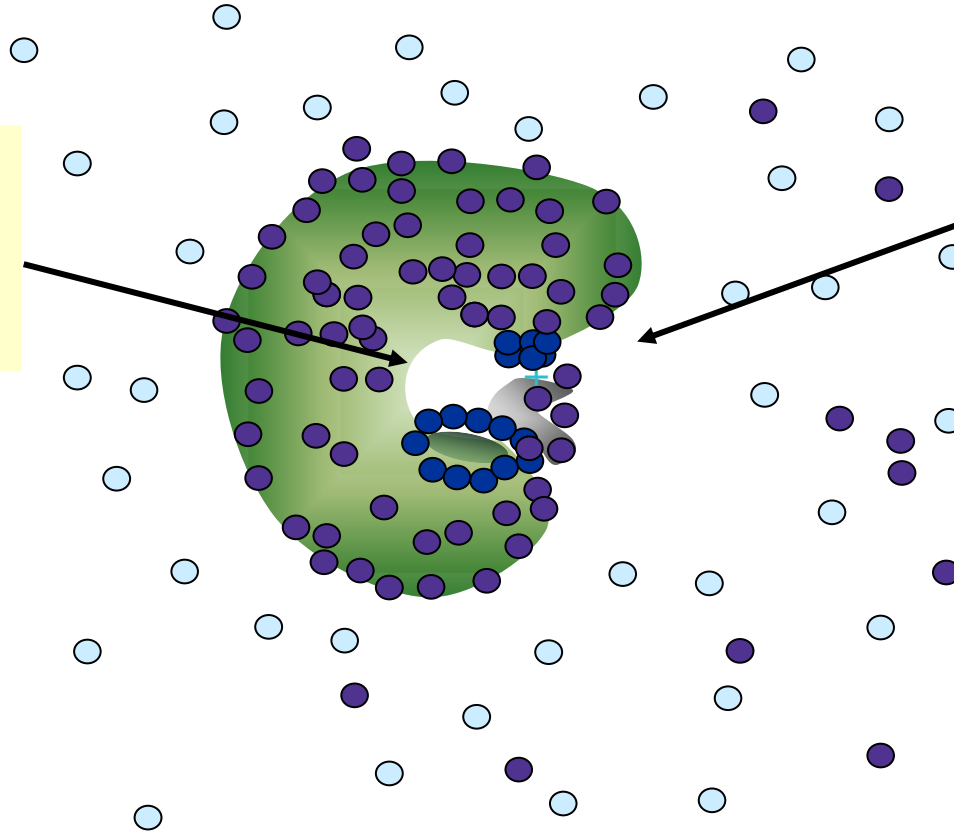
....and is a very complex multi step process



...docking of the ligand to form the complex

Formation of
Ionic / hydrogen
bonds
v. d. Waals
interaction

Full desolvation
of residual
solvent

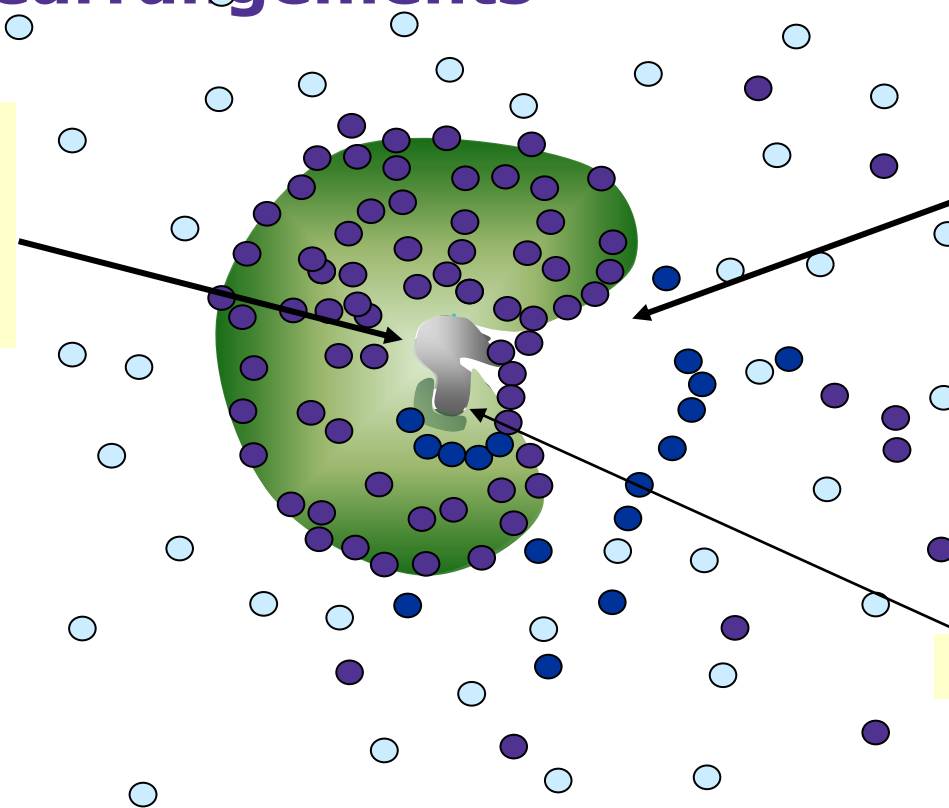


...eventually with induced fit or structural rearrangements

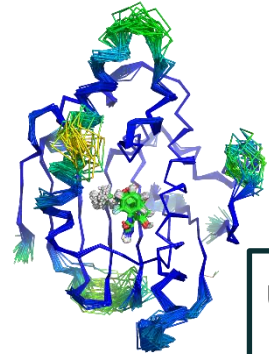
Formation of
Ionic / hydrogen
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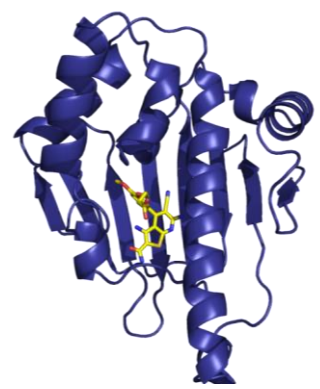
Conformational change



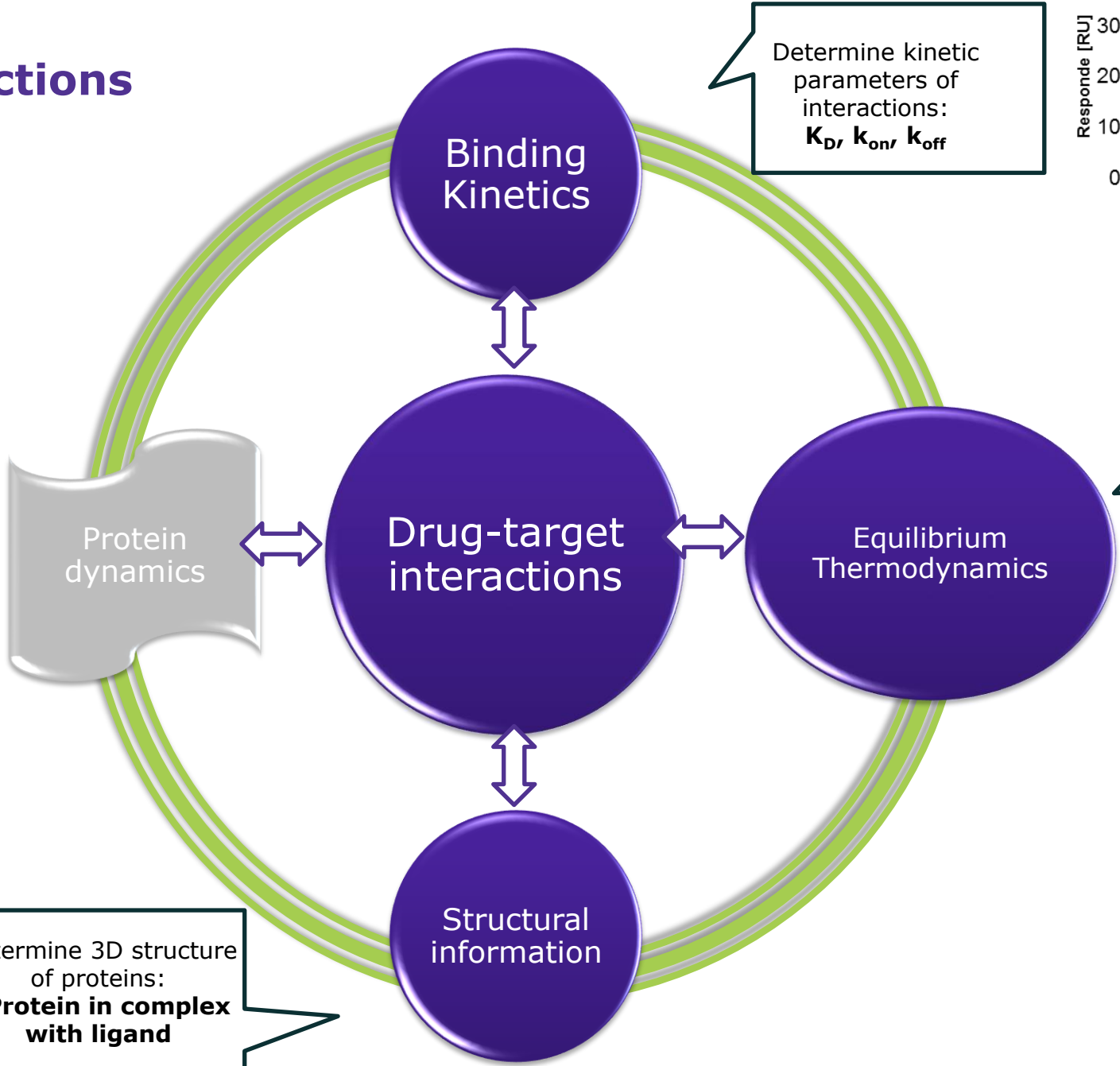
Drug-Target interactions



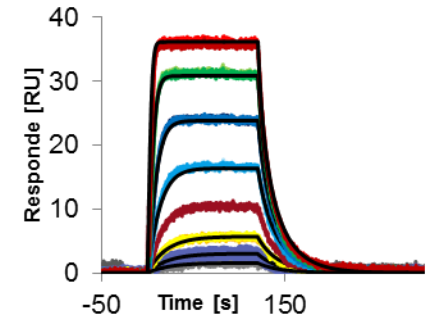
Understand the role of protein dynamics in drug target interactions:
NMR and MD



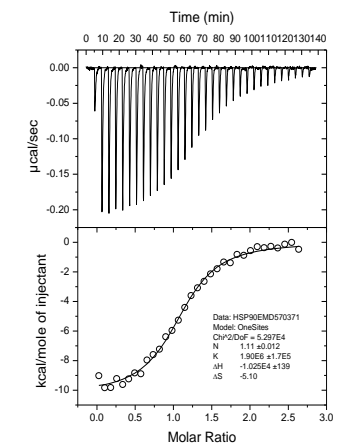
Determine 3D structure of proteins:
- **Protein in complex with ligand**



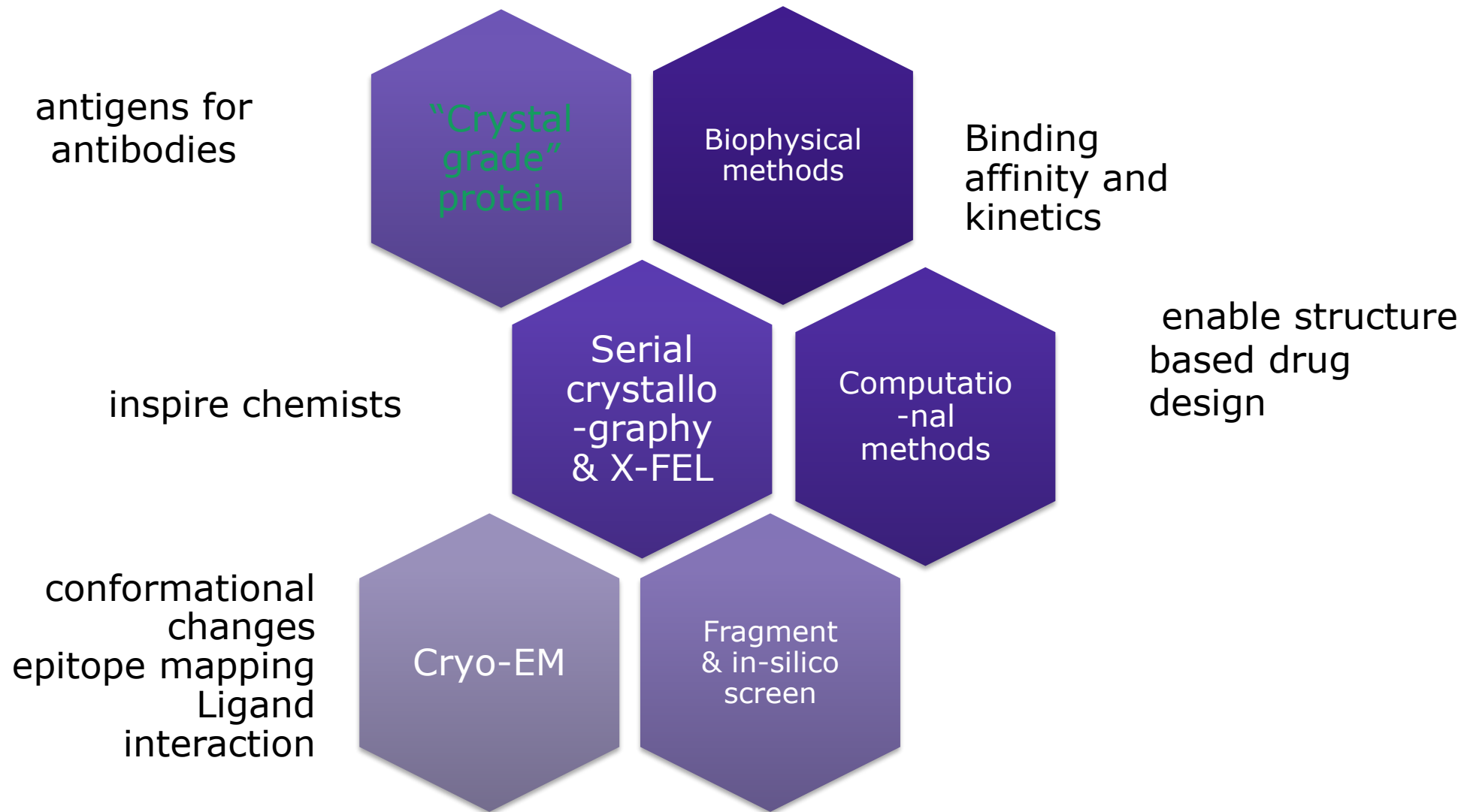
Determine kinetic parameters of interactions:
 K_D , k_{on} , k_{off}



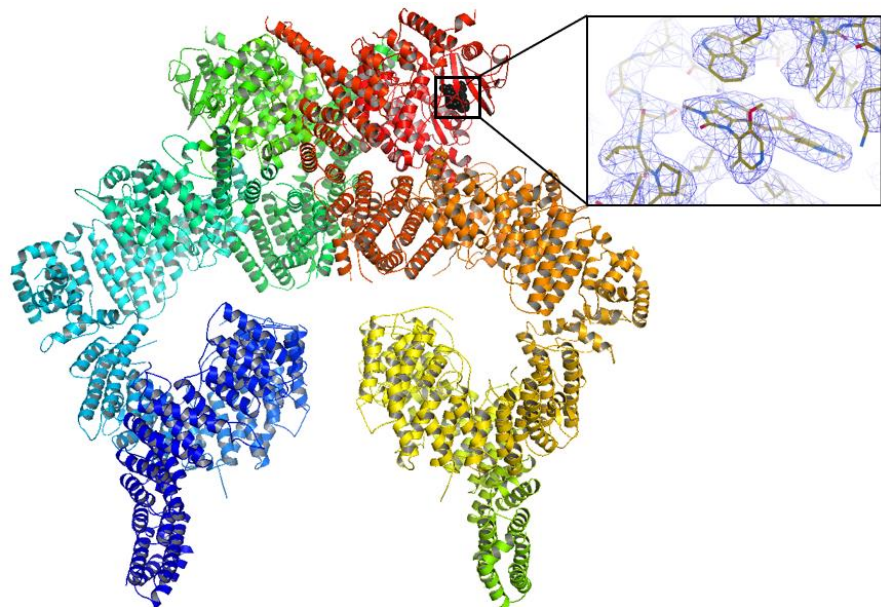
Determine thermodynamic parameters of interactions in solution:
 K_D , ΔG , ΔH , ΔS



The proper integration of the methods into the organization and projects enables an efficient drug discovery

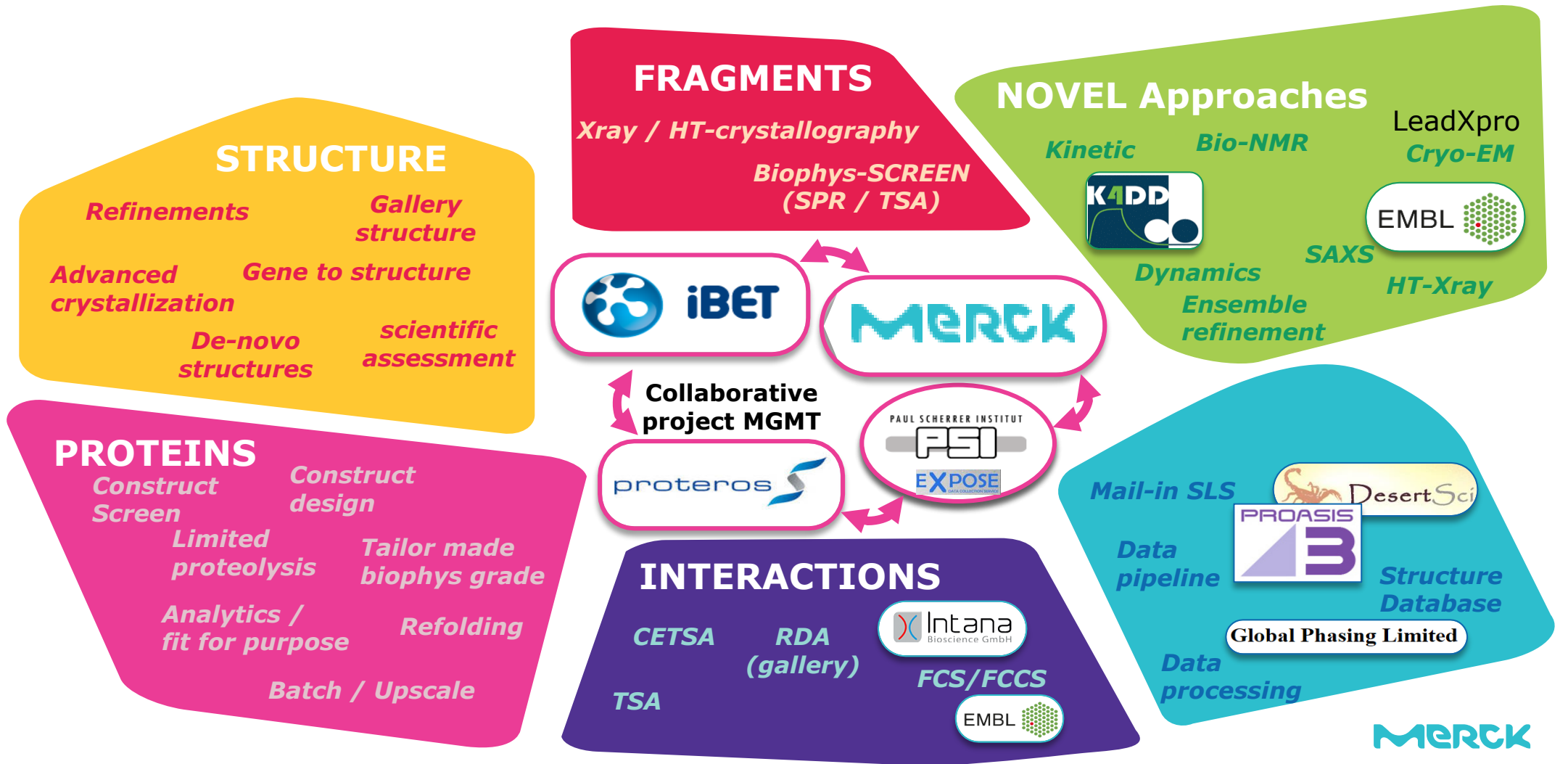


Cryo EM can help to analyze difficult targets and will be a highly valuable
Methods to further advance our target understanding



Cryo EM structure of human full-length ATM with inhibitor M4076 solved at 3.0 Å. Published in Nature Struct. & Mol. Biology. This would be the first published ATM structure with an inhibitor and at the highest resolution.

Internal and External Scientific Collaboration Network to support NBE and NCE Projects



Thank you for your attention



efpia



K4DD



imi

Innovative Medicines Initiative



MERCK

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Djordje Musil, Daniel Schwarz
Jörg Bomke, Ansgar Wegener,
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- Faustine Henot, Jerome Boisbouvier