

Fragment Based Ligand Discovery: X-ray crystallography as a screening tool

Smaller is Better

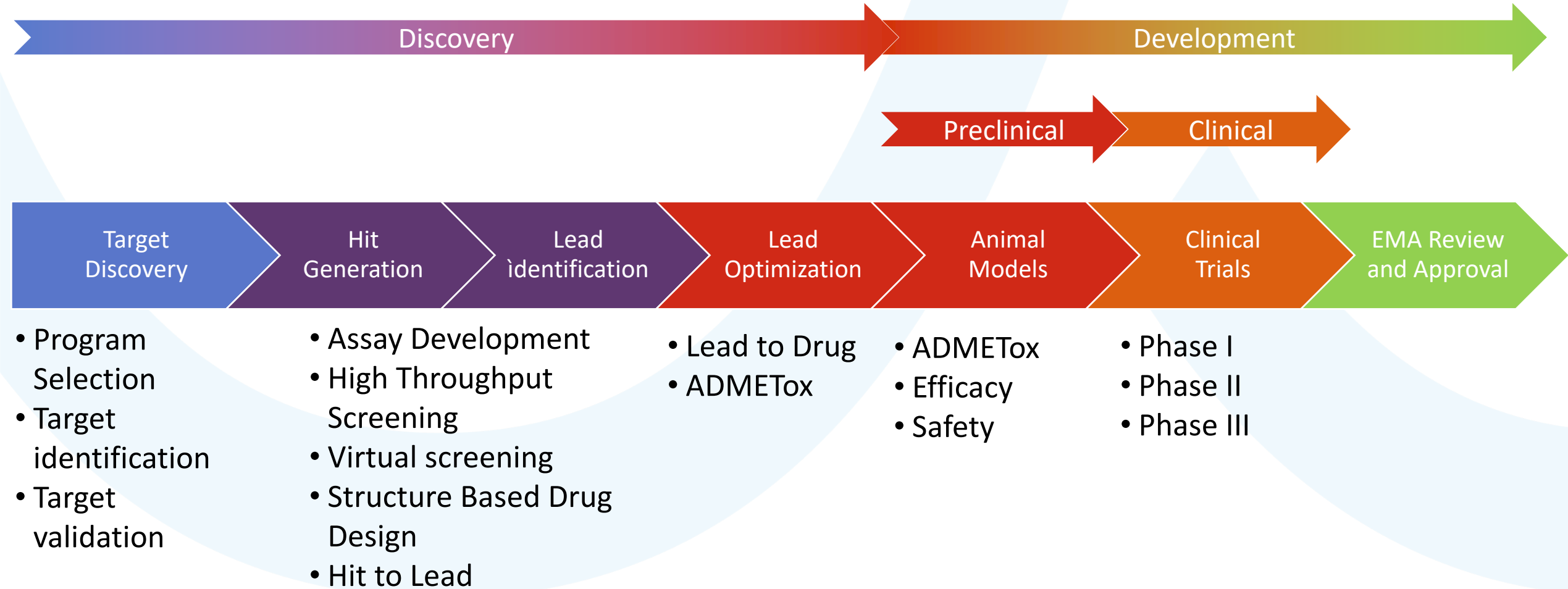
Overview

- The drug discovery process
- How can we find our first hit?
- FBLD: smaller is better
- FBLD: screening methods
- X-ray crystallography as a screening tool
- Practical considerations
 - Optimizing crystallization
 - Efficient soaking/co-crystallization
 - High throughput data collection and processing
 - Looking for binders
 - Refinement
 - PDB deposition
- Does it really work?

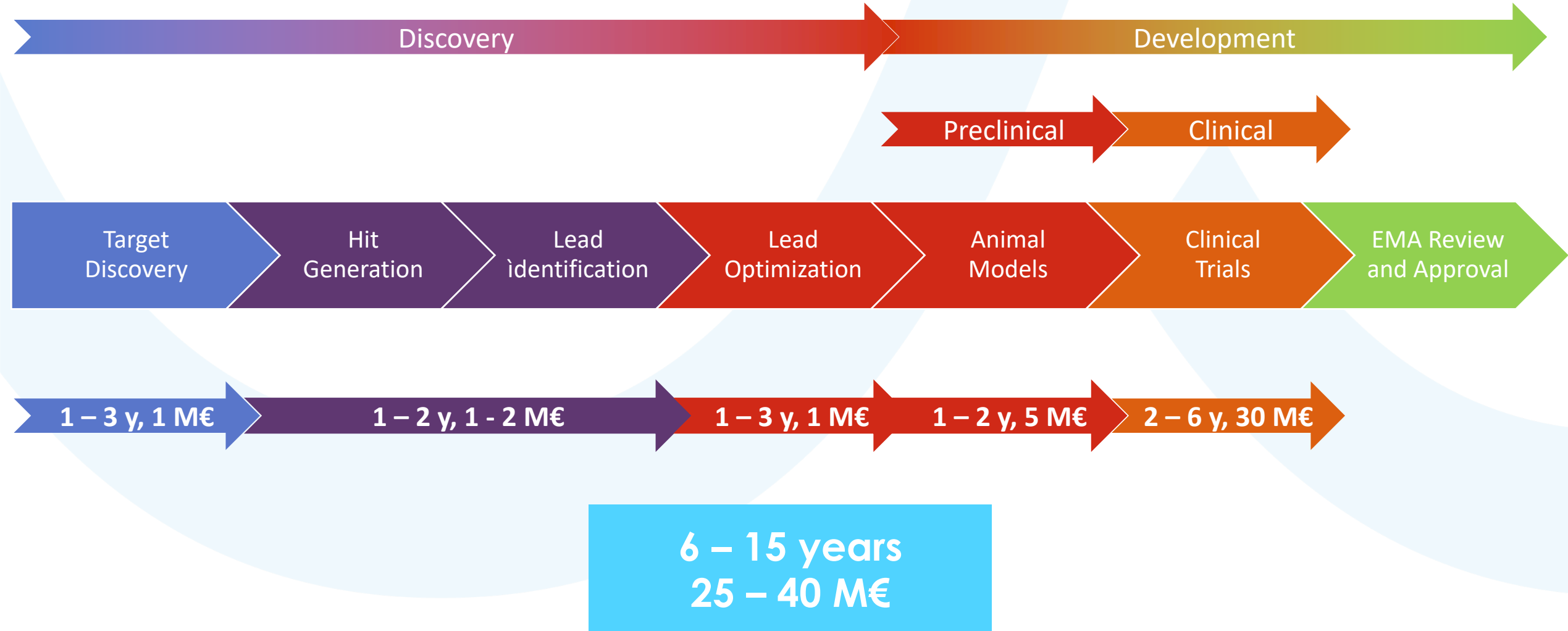
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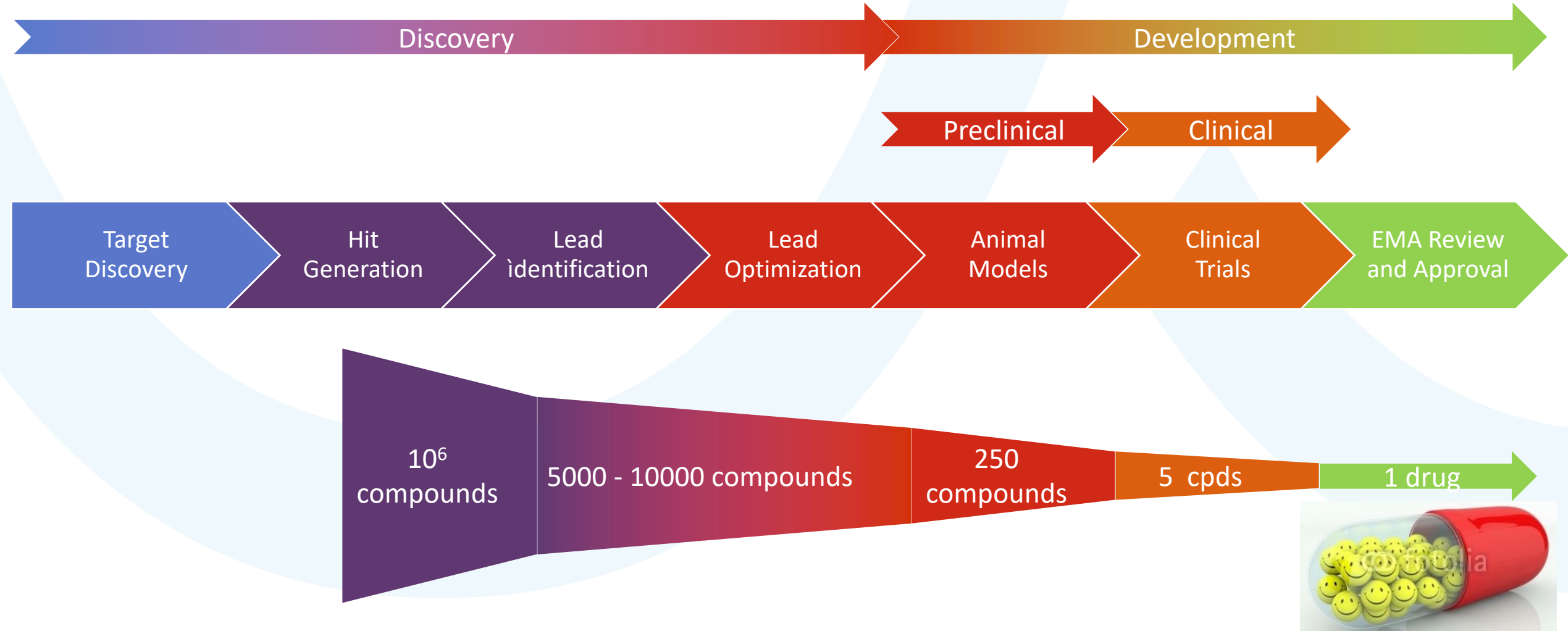
The drug development process



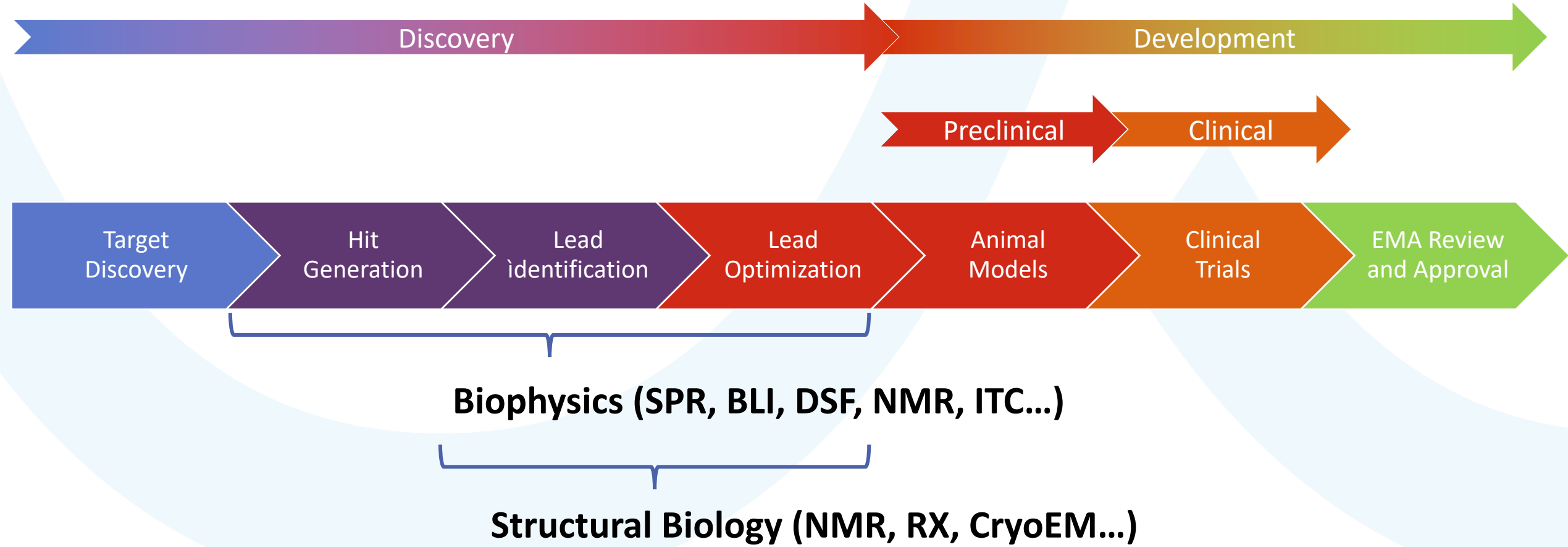
A long and expensive process



A high attrition rate



Where can we help?



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At the beginning, is the hit

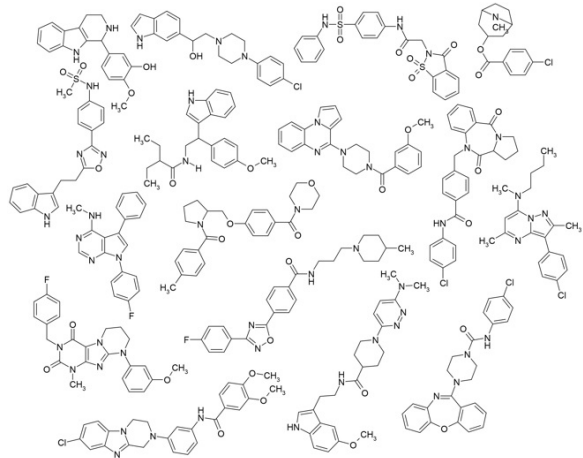


A hit is any chemical compound that binds at the target site.

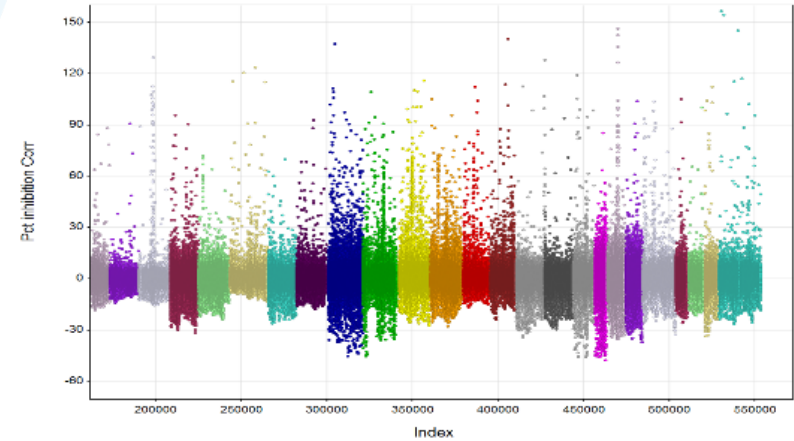
It provides a scaffold upon which medicinal chemists can elaborate more potent compounds.

- Prior knowledge
- HTS
- Virtual screening
- ...

HTS: huge libraries, large compounds



Screening
(enzymatic, cellular,
phenotypic,...)
Single point



Chemical library
($10^5 - 10^6$ compounds)



Primary hits (1 %)
Confirmation assay
(triplicate)
Counter assay
Dose response
A few compounds left

HTS: what do we have in the libraries?

- A **detectable** biological activity, ie an affinity for the target in the (high-) micromolar range
- No highly reactive species (known as PAINS)
- « easily » transformed in drugs (biodisponibility, solubility...)

The rule of five (RO5, aka Lipinski's rules) :

- < 500 Da
- $\text{ClogP} < 5$
- < 5 H-bond donors
- < 10 H-bond acceptors

$\log P = \log(\text{partition coefficient octanol/water})$

HTS: what do we have in the libraries?

Sanofi's chemical library (2015) :

- >1,5 M compounds
- 22 FTE for compound management
- 4500 m²
- 30 M€ running costs

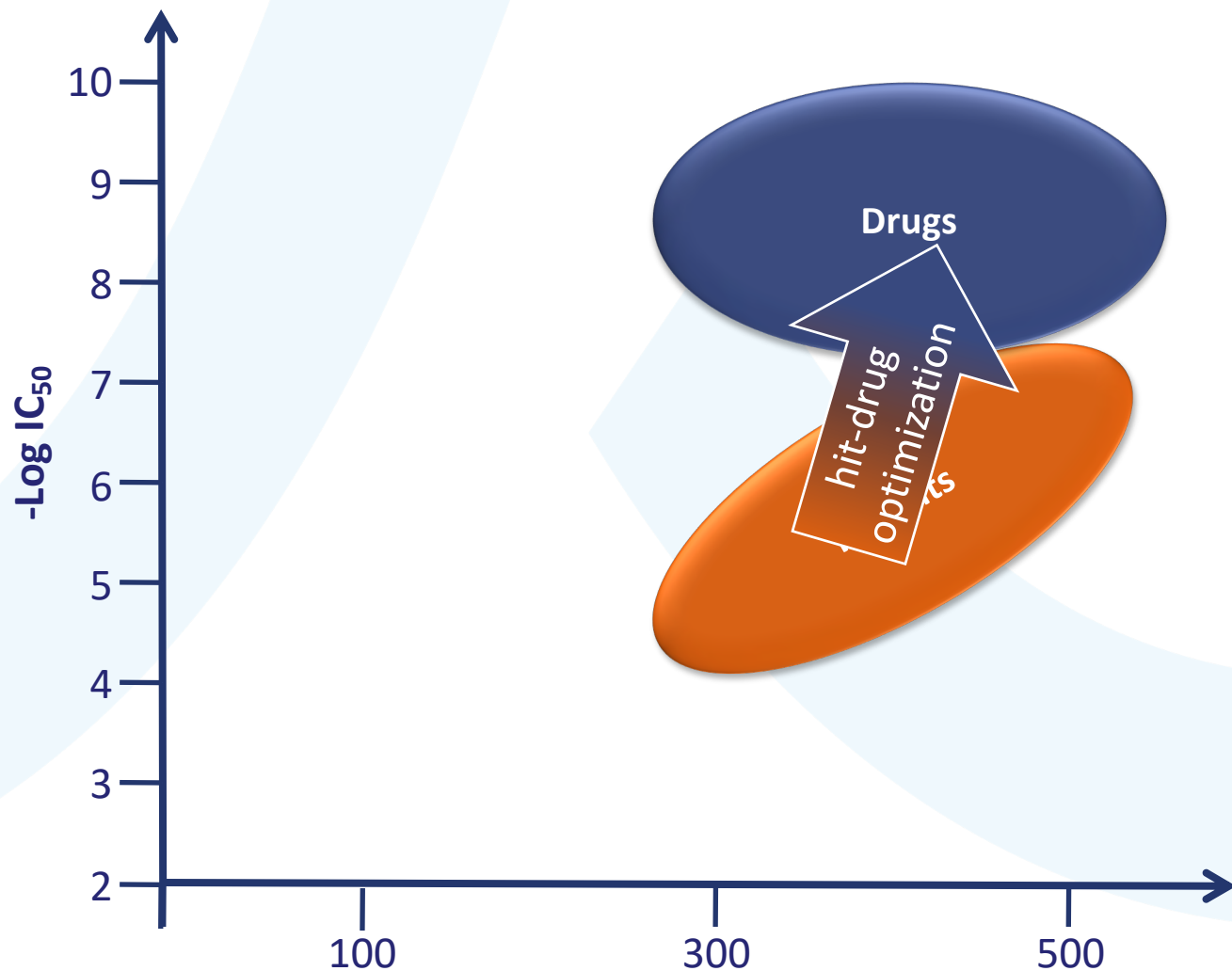
Only possible for
big pharma



HTS: what about chemical diversity?

- 500 Da : about 30 non-H atoms
- 10^{60} possible compounds
- 10^8 known compounds
- 10^6 in the library

Accessible chemical diversity is a tiny portion of the real chemical diversity



Hits have to be optimized at a constant molecular weight

Molecular weight (Da)

If you are not a big pharma, keep it small

Rules of 5

- MW < 500 Da
- < 5 H-bond donors
- < 10 H-bonds acceptors
- ClogP < 5

DRUG LIKE

- 10^{60} possible compounds
- 10^8 known compounds
- 10^6 in library

Rules of 3

- MW < 300 Da
- < 3 H-bond donors
- < 3 H-bonds acceptors
- ClogP < 3

FRAGMENT LIKE

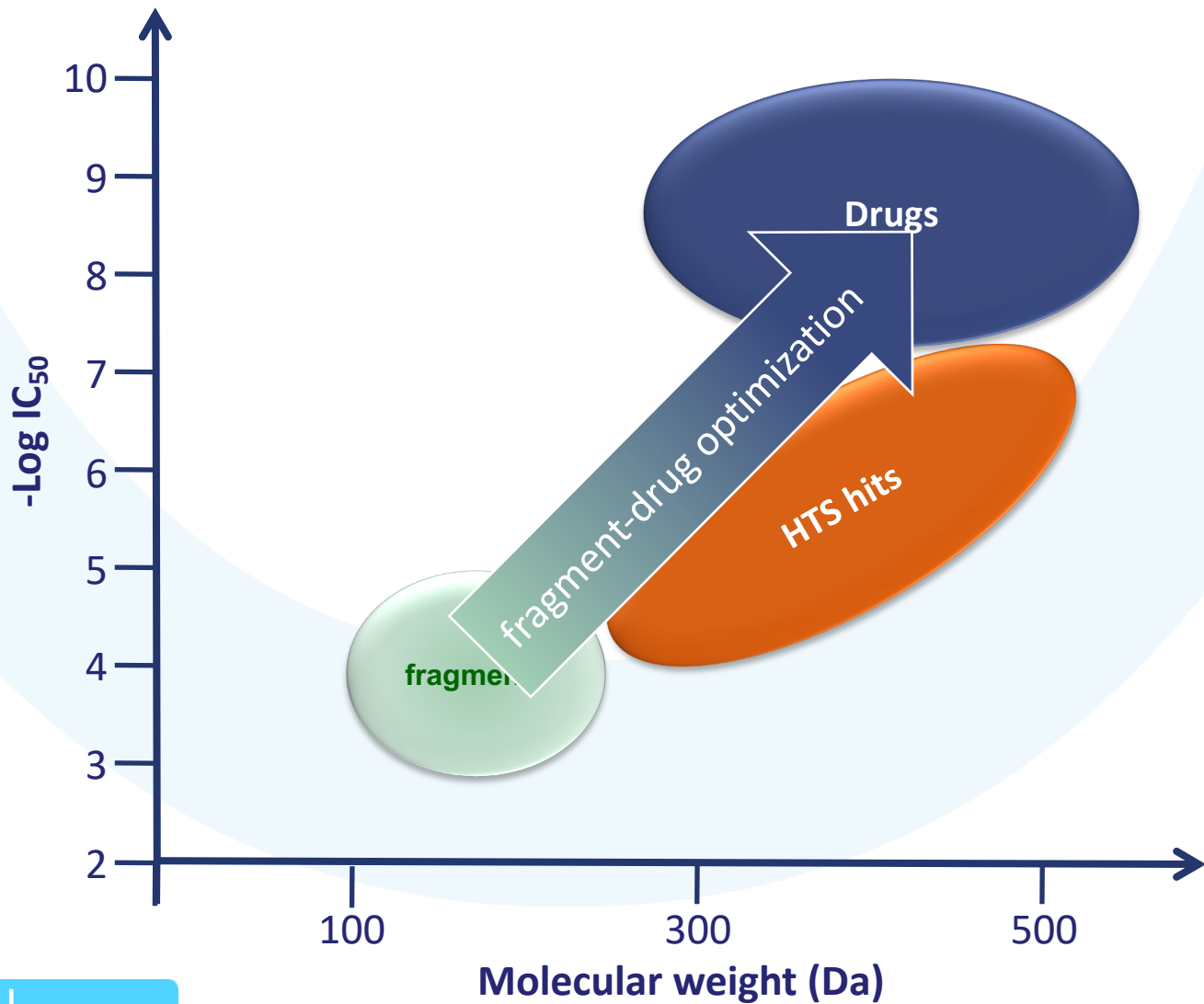
- 10^9 possible compounds (180 Da)
- 10^5 known compounds
- 10^3 in library

Fragments:
better at exploring the available
chemical diversity

Overview

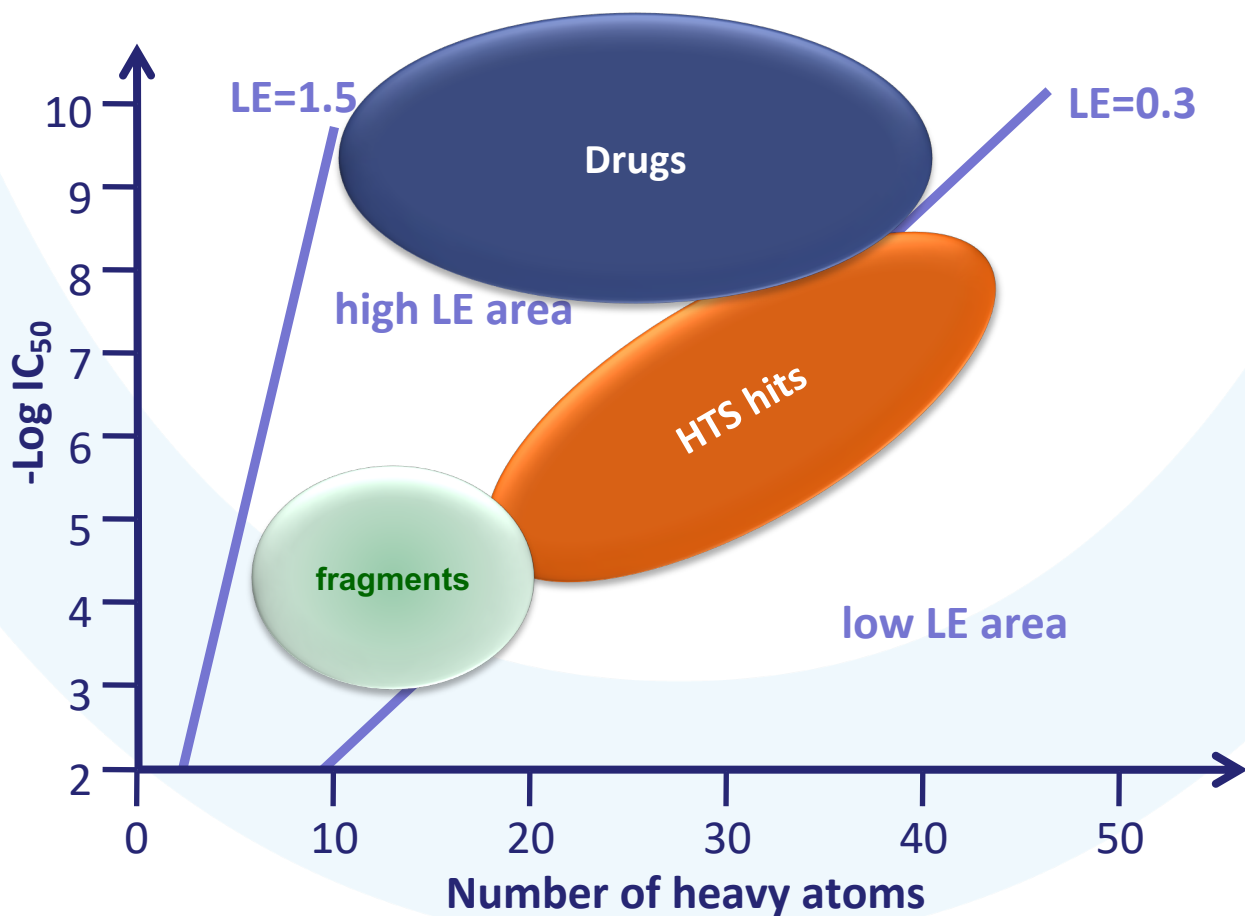
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Smaller is better...

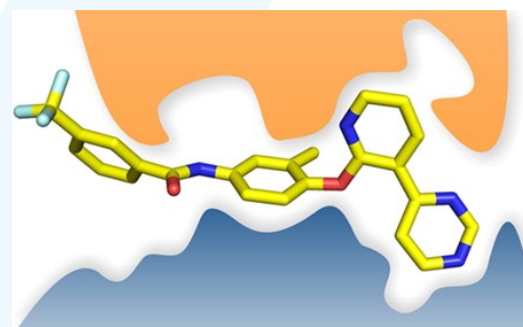


Fragments:
« Easier » optimization

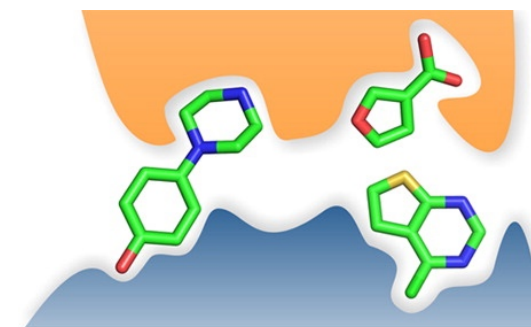
Smaller is better...



$$LE = \frac{-\Delta G \text{ (kJ/mol)}}{\text{nb. of non hydrogen atoms}}$$



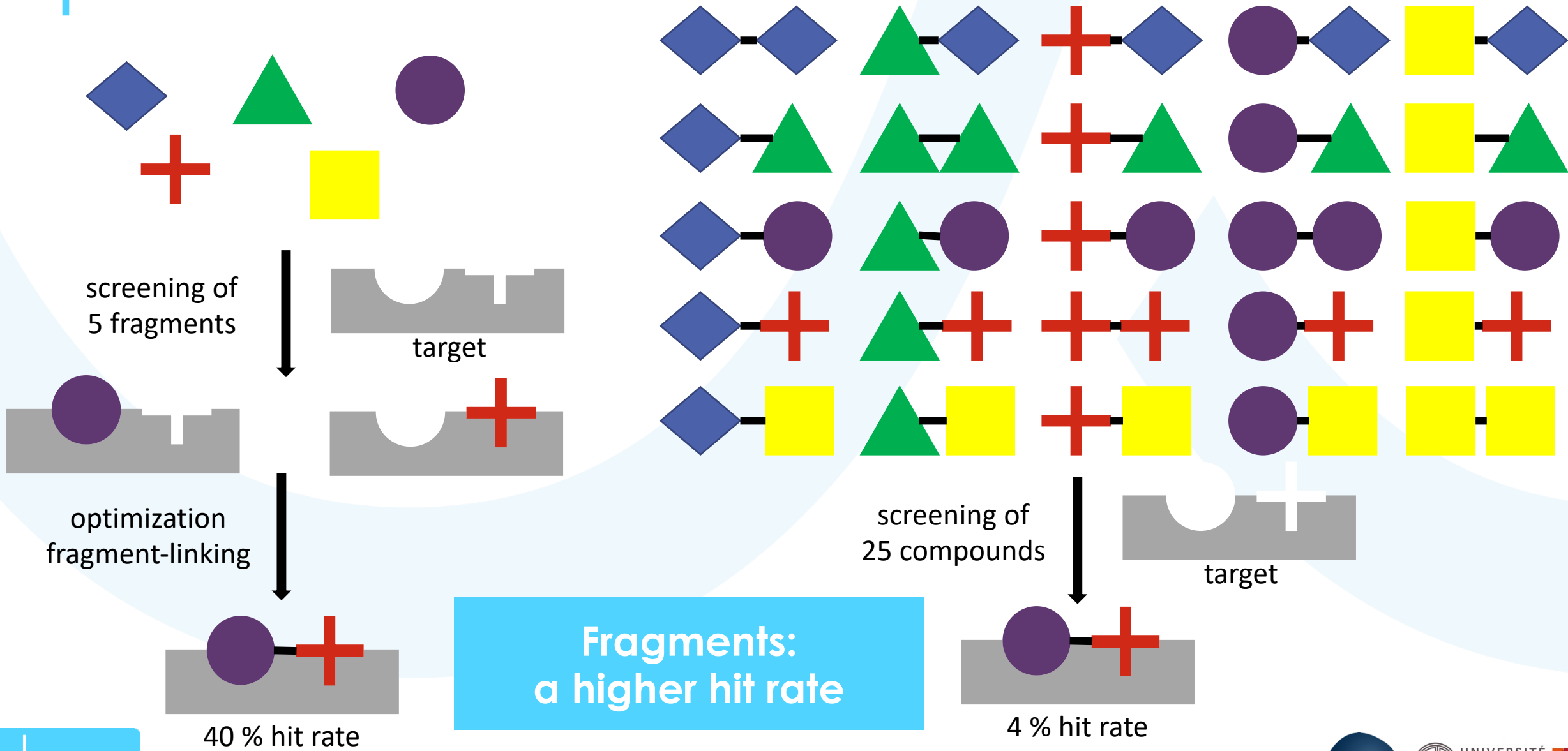
HTS hit: multiple suboptimal interactions



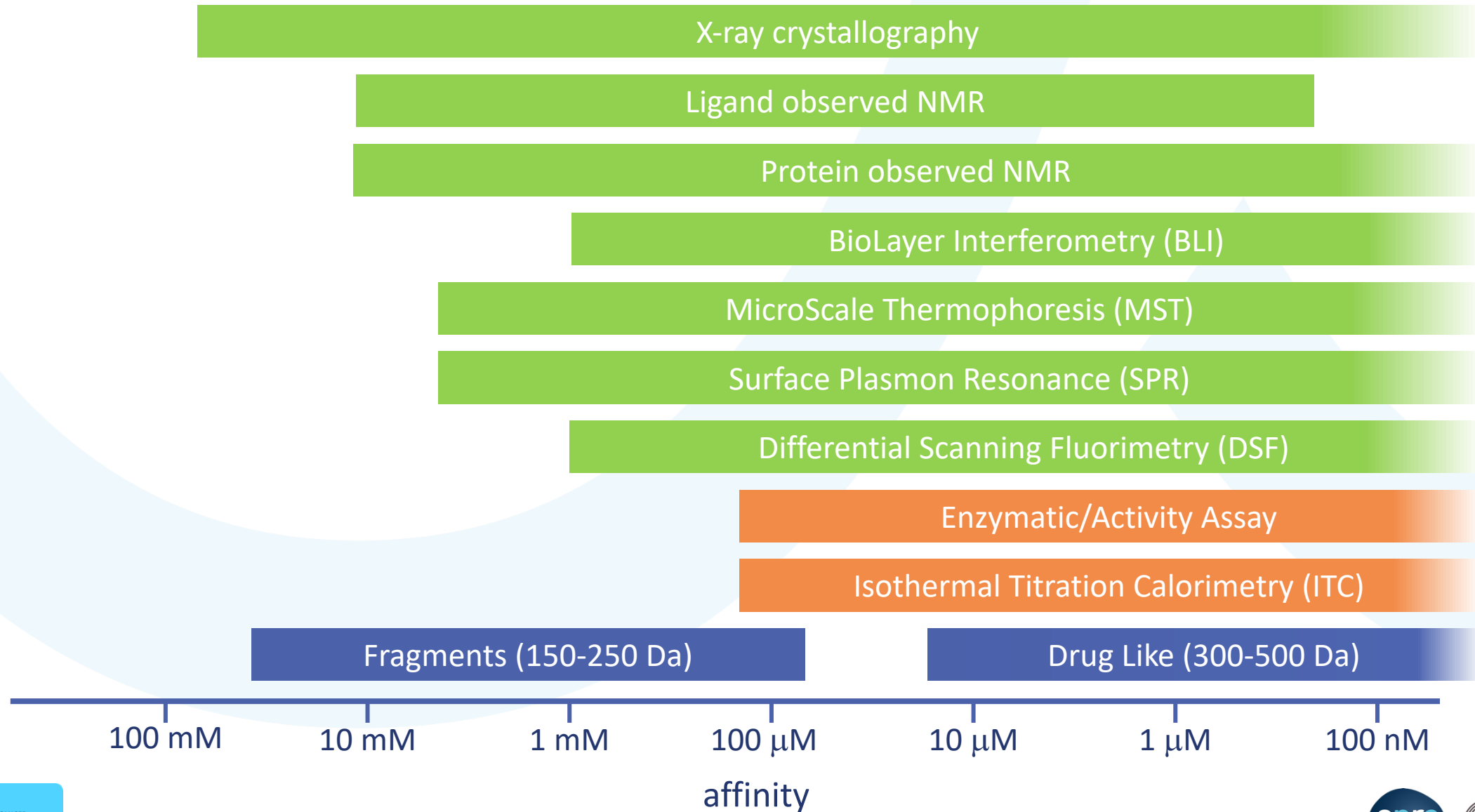
fragment hit: few optimized interactions

**Fragments:
better ligand efficiency**

Smaller is better...



...but binding is weaker

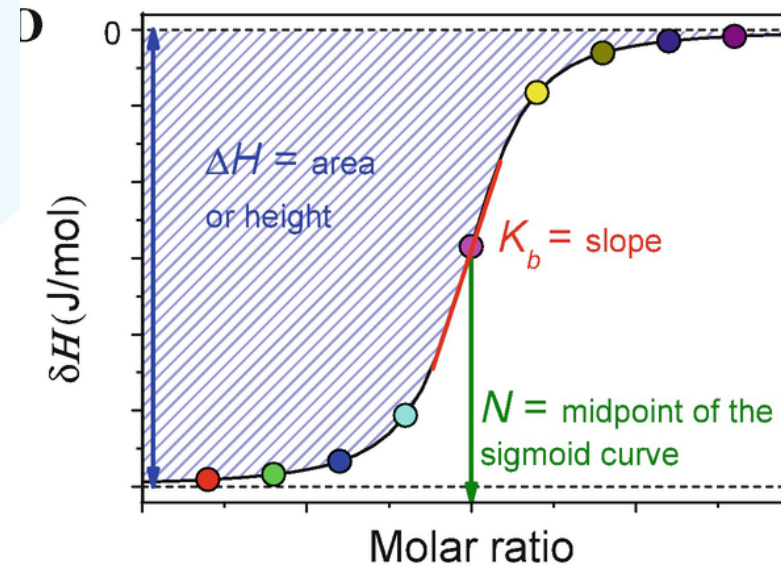
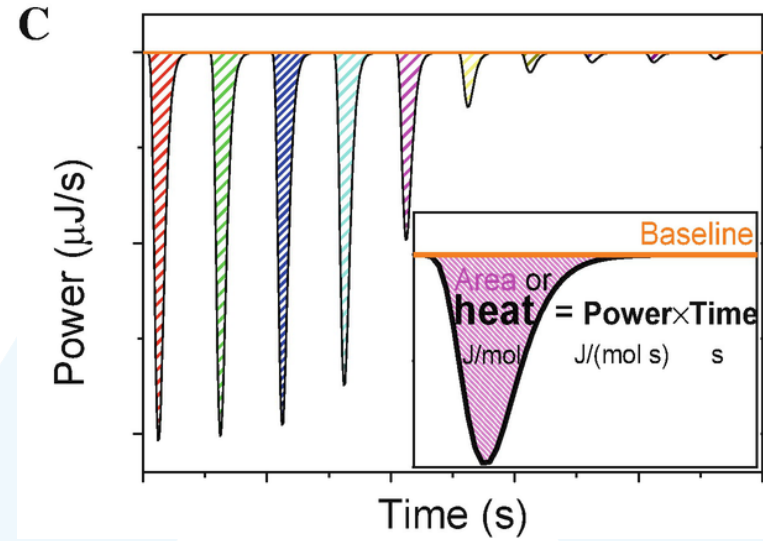
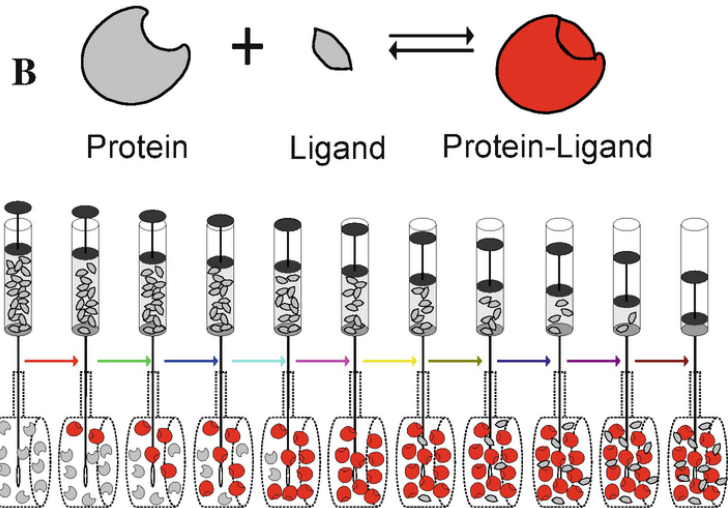
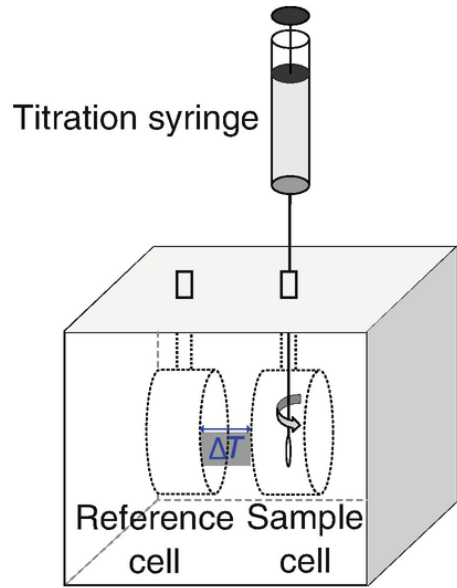


Adapted from Hubbard, 2011

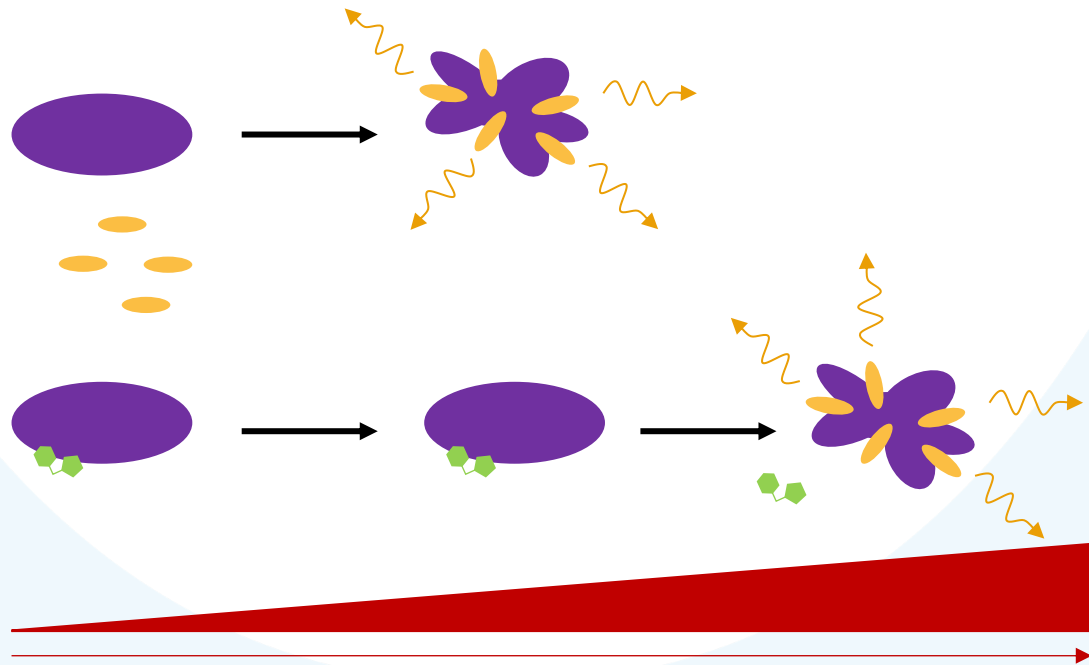
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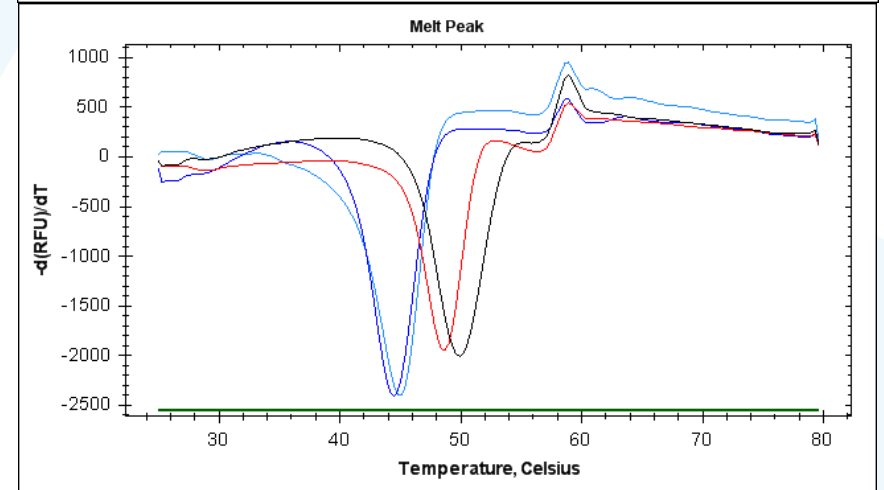
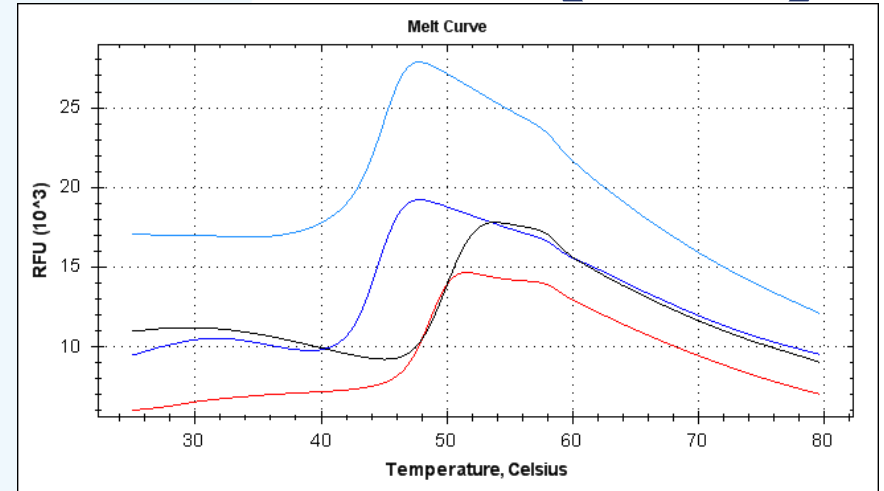
Isothermal Titration Calorimetry (ITC)




Differential Scanning Fluorimetry (DSF)

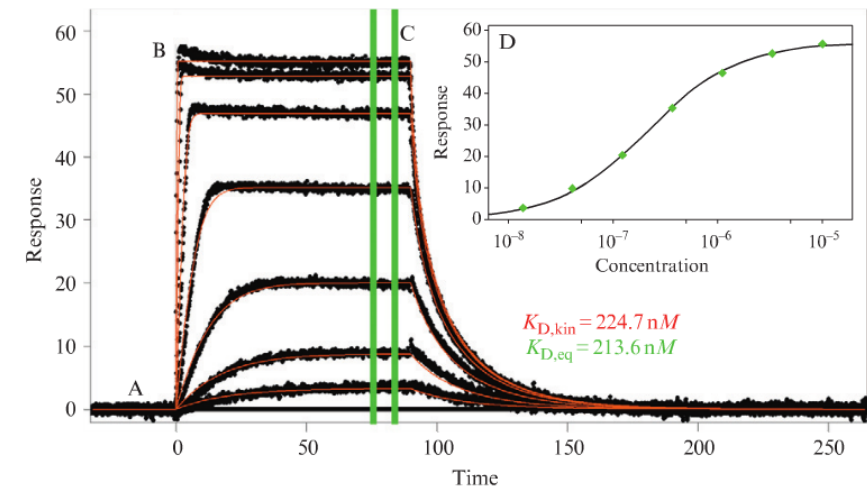
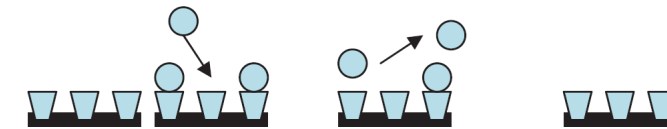
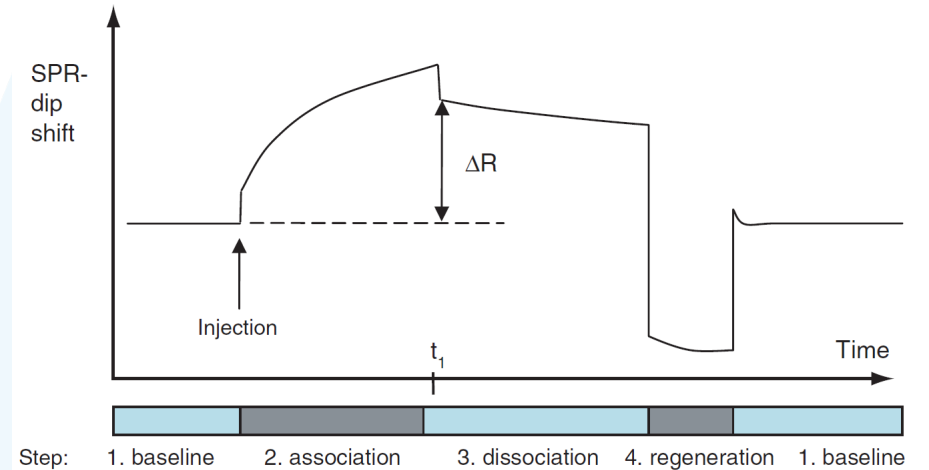
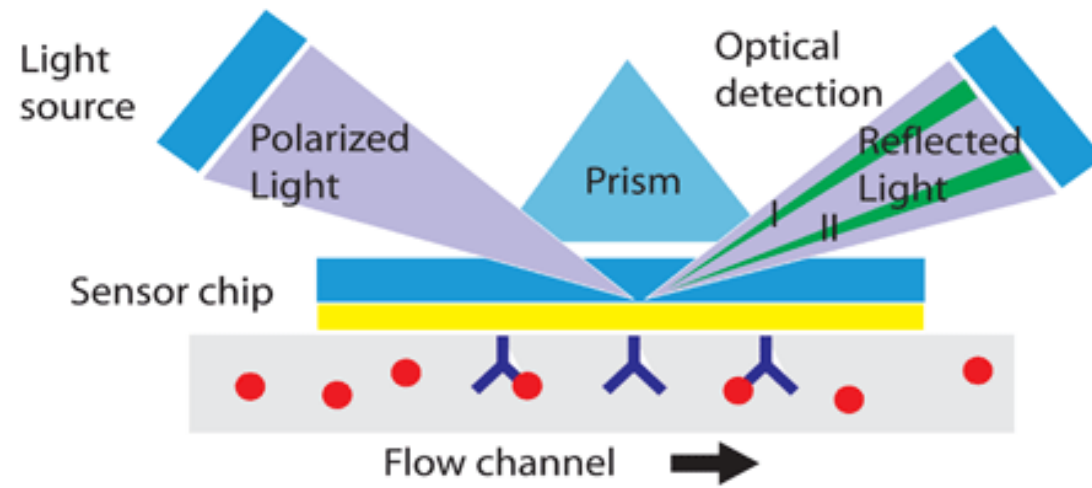


-  Protein
-  Sypro® Orange
-  Unfolded protein
-  Fluorescence
-  Ligand



-  protein
-  protein + fragment
-  protein + ligand 1
-  protein + ligand 2

Surface Plasmon Resonance (SPR)

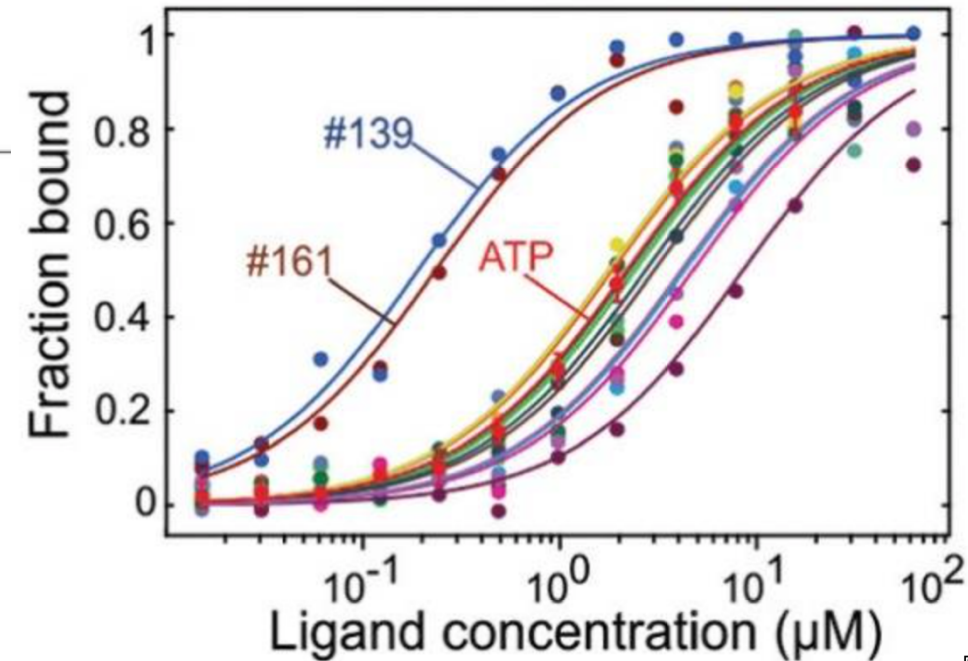
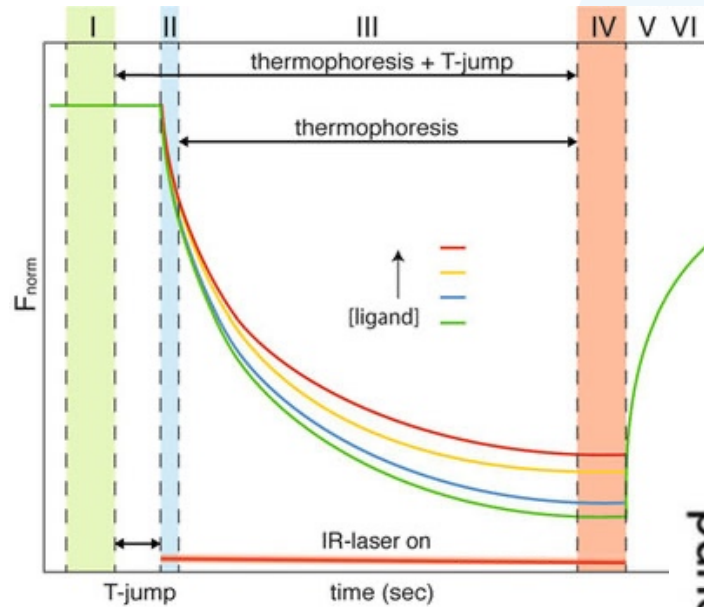
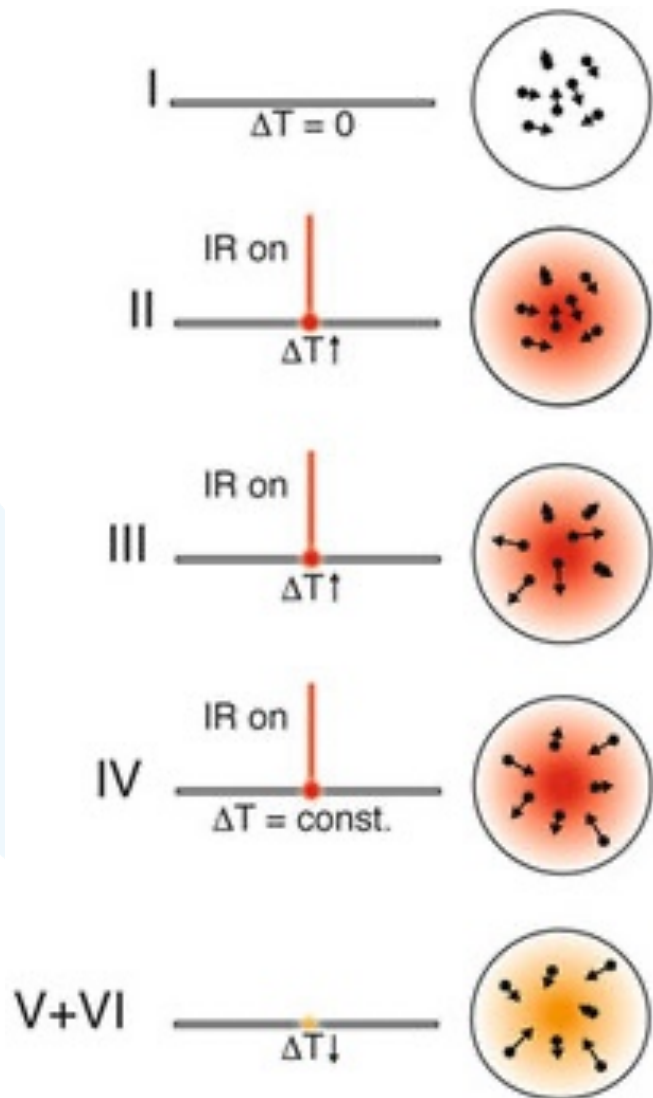


Tudos, 2008

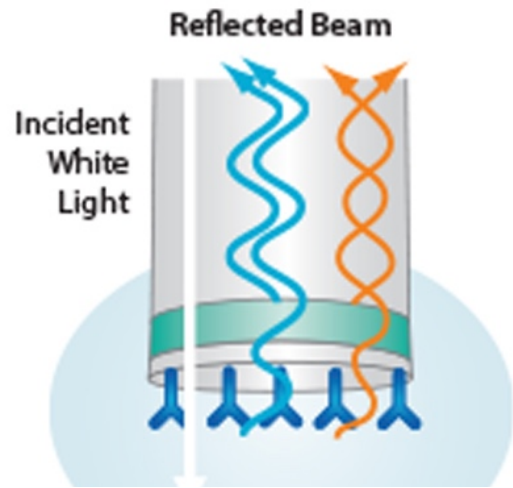
Gianetti, 2011

<http://nfs.unipv.it/nfs/minf/dispense/immunology/agabint.html>

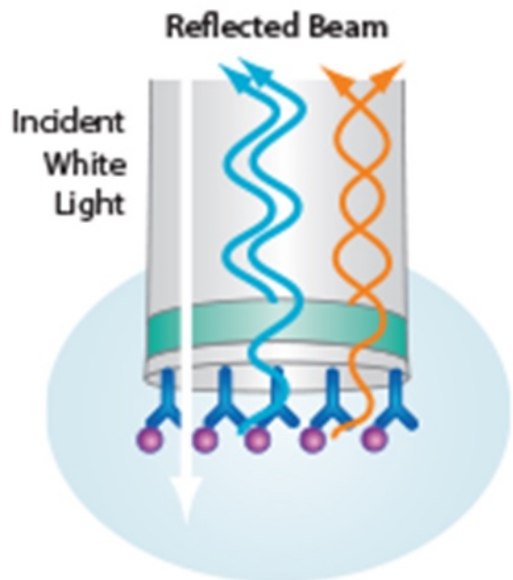
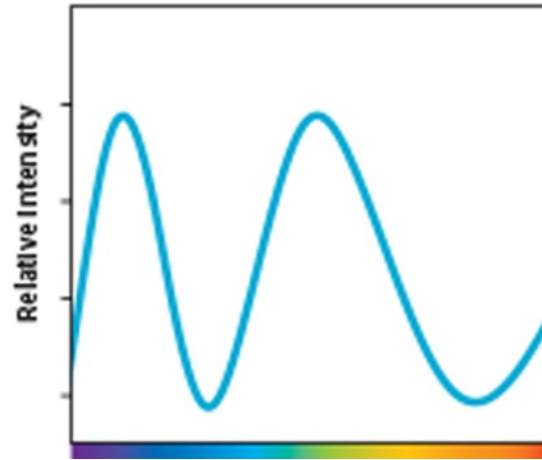
MicroScale Thermophoresis (MST)



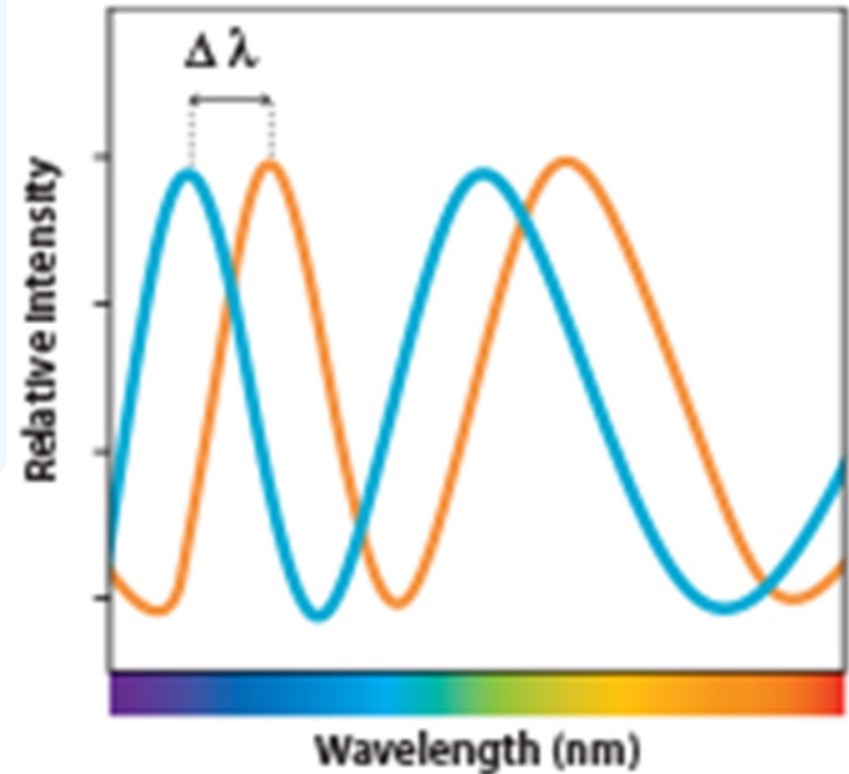
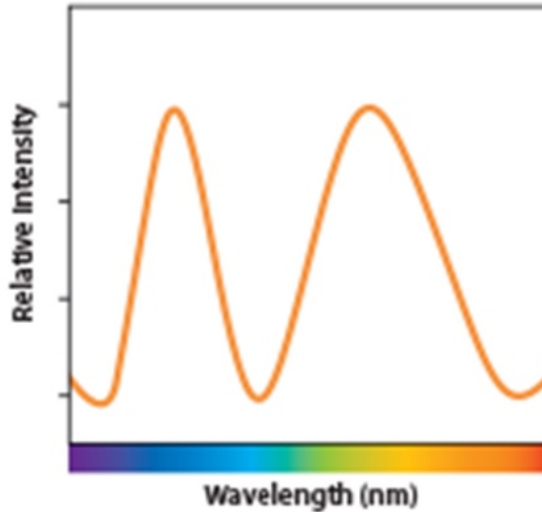
BioLayer Interferometry (BLI)



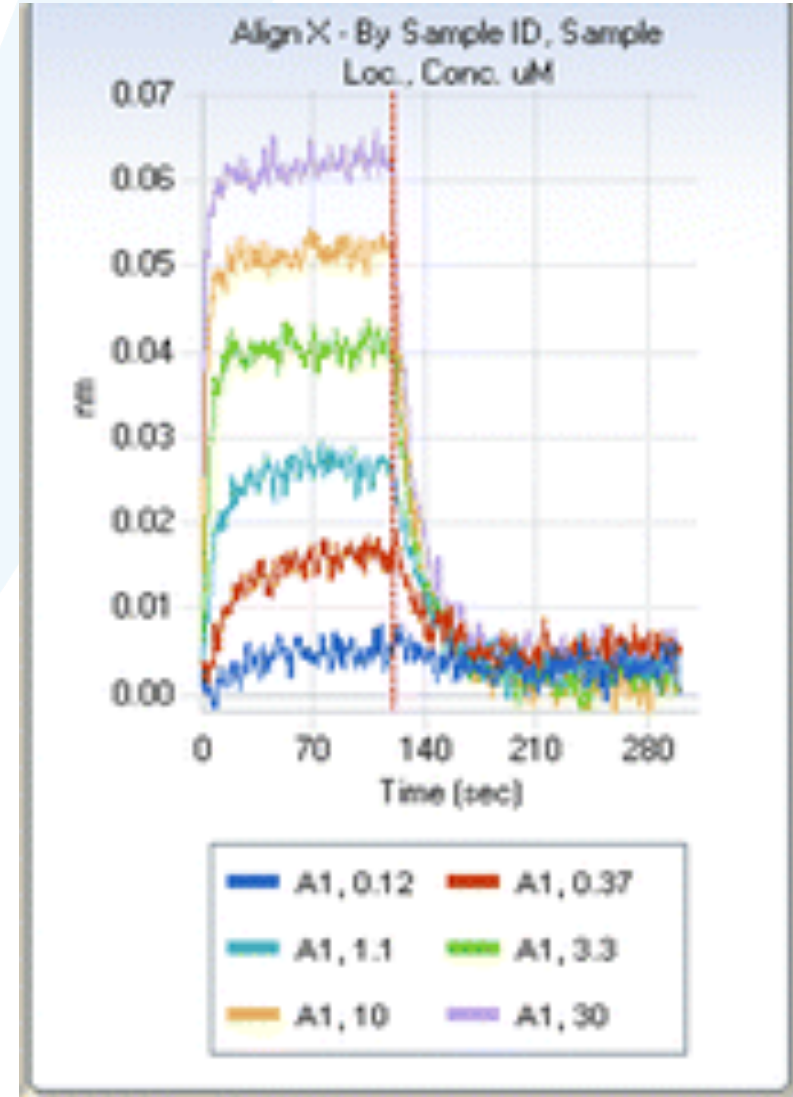
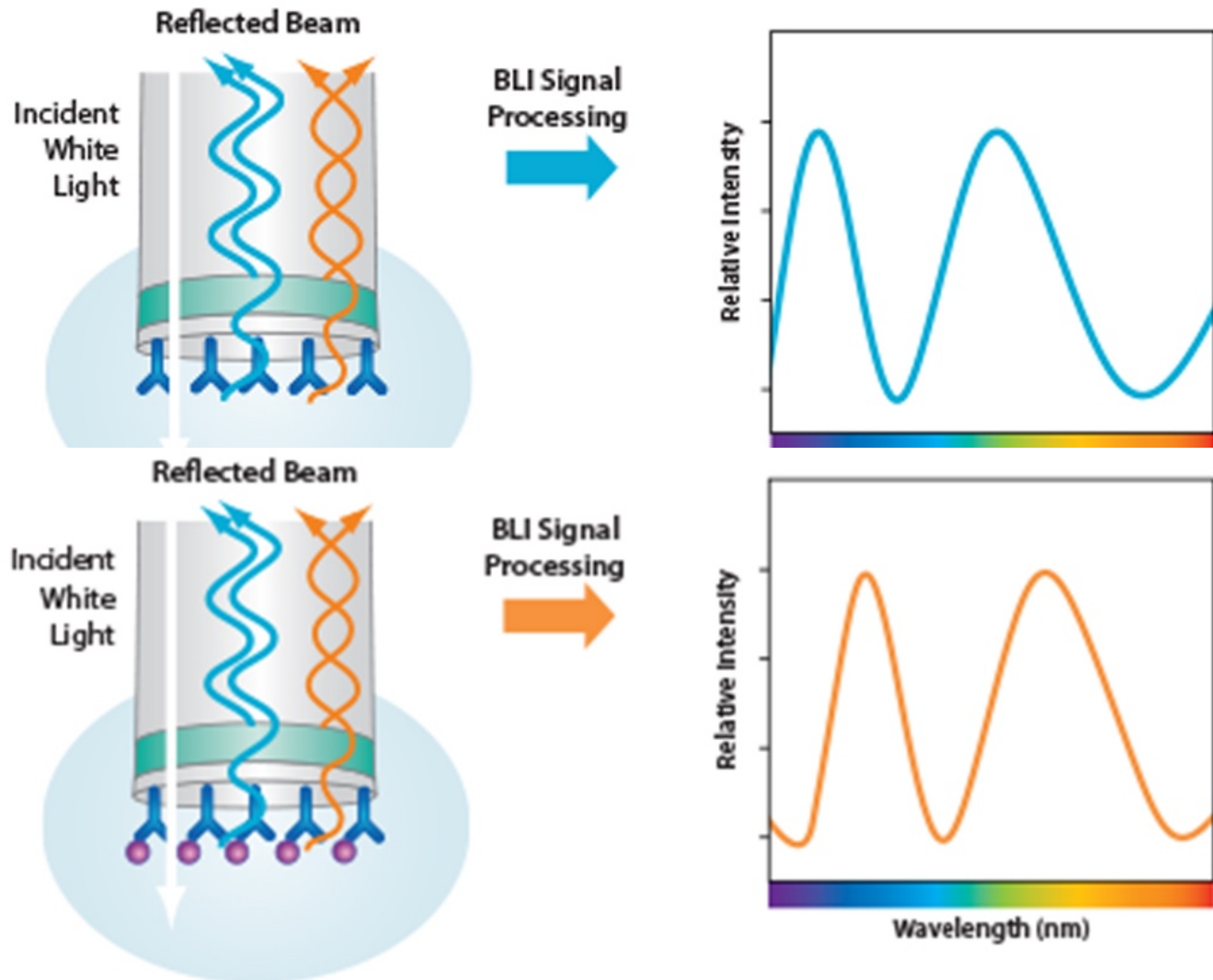
BLI Signal Processing



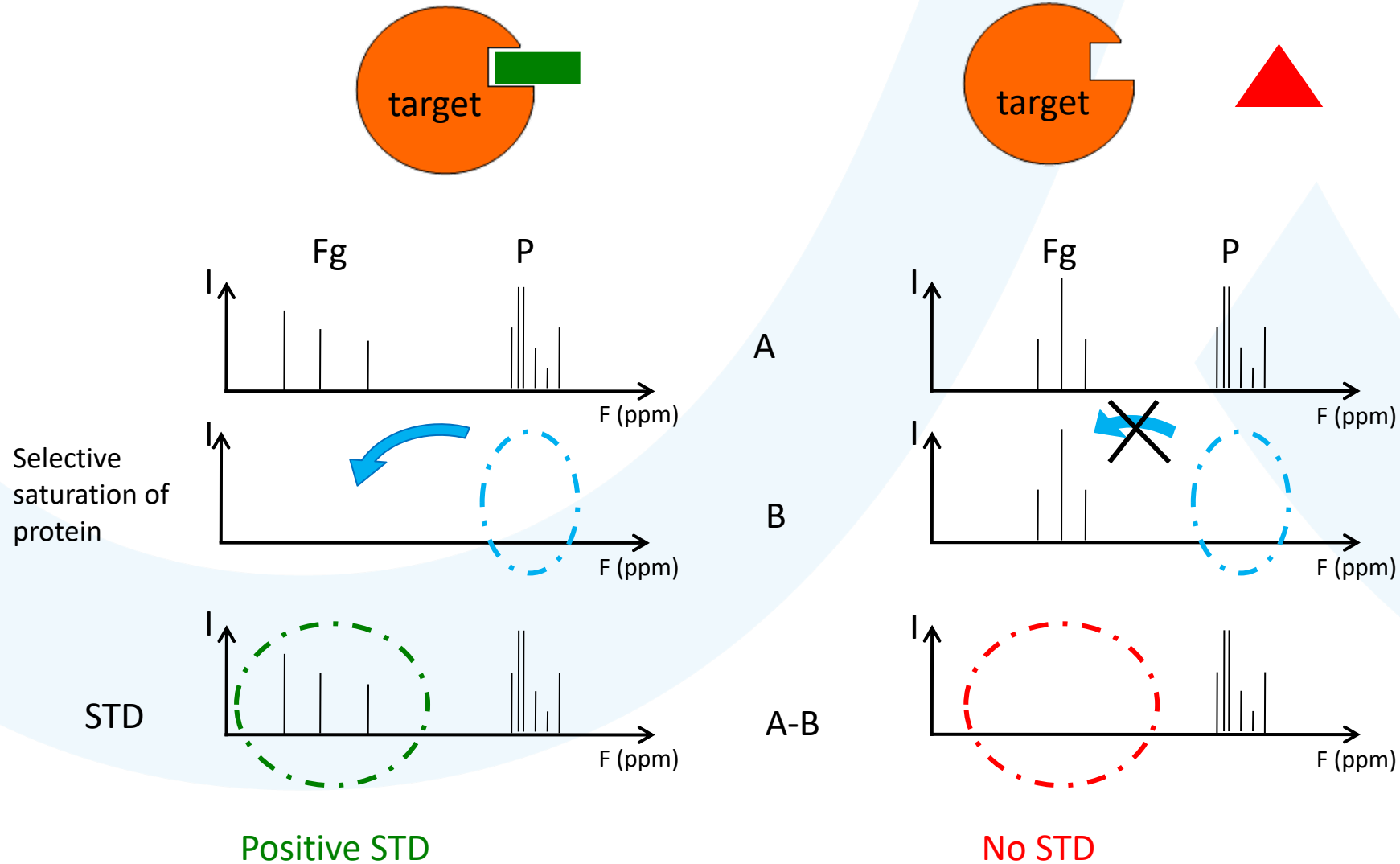
BLI Signal Processing



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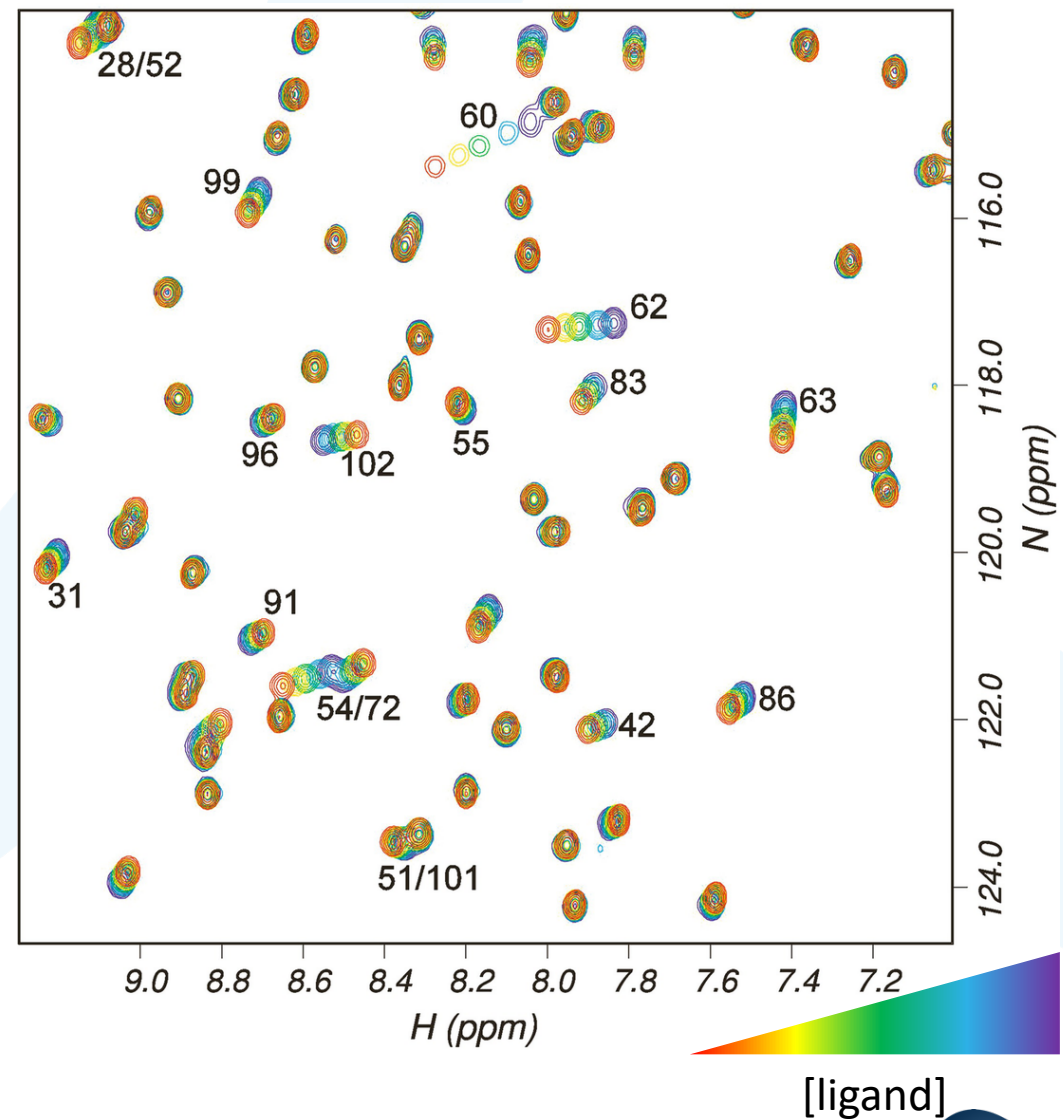


NMR: ligand observed NMR (STD)

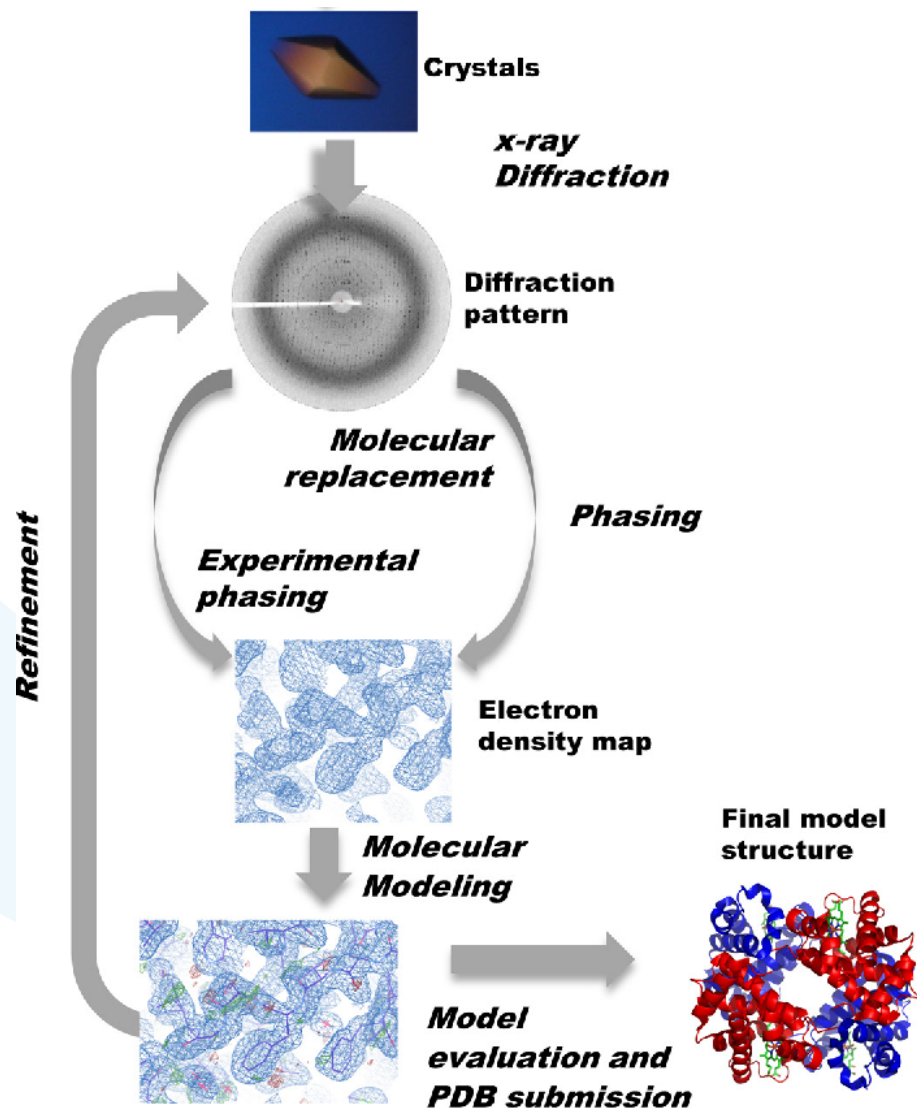


NMR: protein observed (CSP)

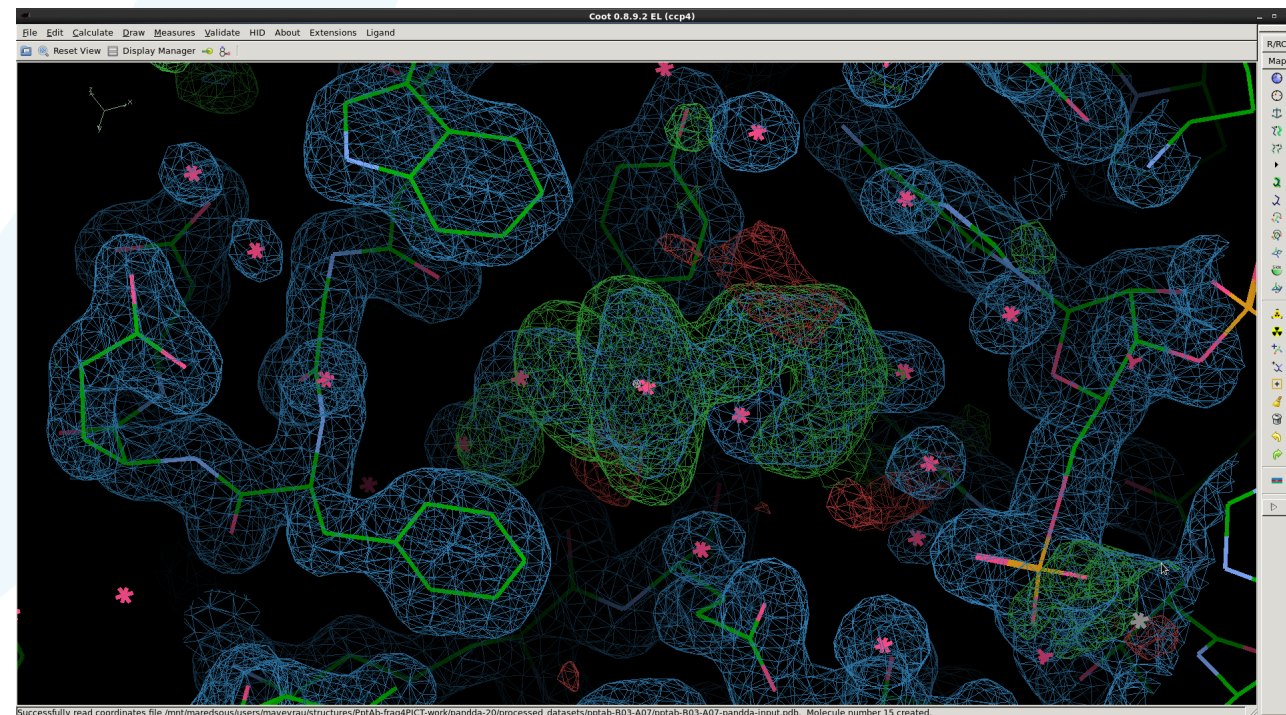
[^{15}N , ^1H]-HSQC spectrum of a ^{15}N labelled protein in absence and in presence of (increasing concentrations of) an unlabelled ligand.



Xray crystallography



Fapo-Fcomplex difference map after crystal soaking:



Biophysical techniques: what do we see?

Method	Label free	Immobilized	Kd range	Binding	Site	Structure
ITC			$10^{-3} - 10^{-9}$			
DSF			$10^{-3} - 10^{-12}$			
SPR			$10^{-3} - 10^{-11}$			
MST			$10^{-3} - 10^{-12}$			
BLI			$10^{-3} - 10^{-11}$			
STD			$10^{-2} - 10^{-10}$			
CSP	¹⁵ N		$10^{-3} - 10^{-9}$			
X-ray			$10^{-1} - 10^{-12}$			

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X-ray crystallography provides the most comprehensive information

- No false positive (but false negative are possible)
- Binding site is known
- Structure of the complex is known, ready for hit optimisation
- But...
 - It is slow (but not that slow)
 - It needs careful thinking beforehand
 - It requires a lot of beam time...

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FBLD by X-ray crystallography

A typical fragment library includes 1000 compounds

- Optimize you crystallisation conditions:
 - Reproducible, cryo-ready, high-resolution (better than 2.2 Å)
- Preparation of complexes:
 - Soaking, co-crystallization
- Crystal cooling
- Data-collection and processing:
 - Unattended automatic data collection & processing
- Detect structures with bound ligand ASAP:
 - PANDDA, pipedream...
- Focus only on complexes (expect 50-100 structures!)

Optimization of crystallization

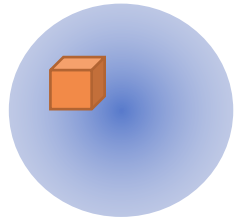
Many crystals will be needed (at best 1 crystal/fragment, but likely more):

- Aim at $> 90\%$ success rate (eg about 80-90 drops with crystals in a 96-well plate)
- If possible, use a cryo compatible crystallization condition (you don't want to cryoprotect each crystal!)
- Check that the crystals diffract to high resolution
- Check that crystals tolerate a few % DMSO
- Check that crystals allow for complex formation
- Higher symmetry spacegroup preferred (not P1!)

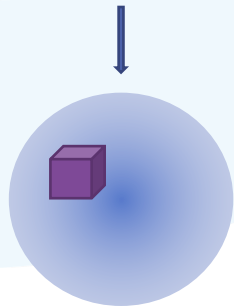
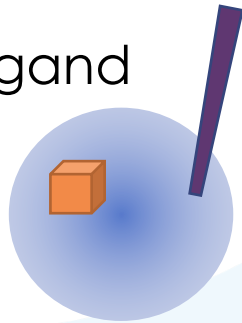
Soaking vs. Co-crystallization

Soaking: get the crystal and add the ligand

1) Crystallize protein



2) Add droplet with ligand

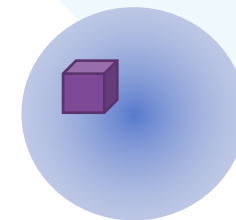


Co-crystallization: add the ligand and get the crystal

1) Add ligand to protein solution

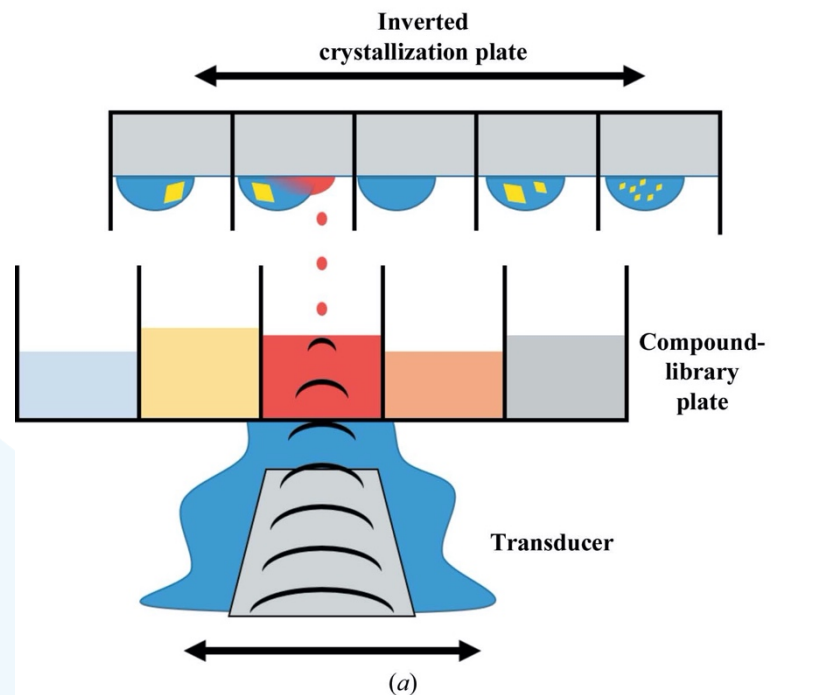


2) Crystallize the complex

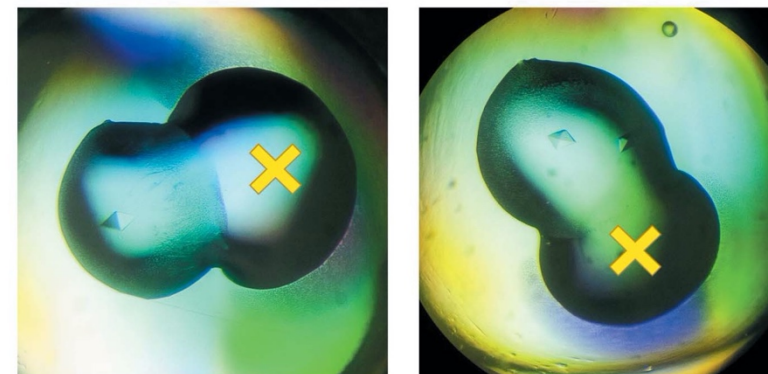
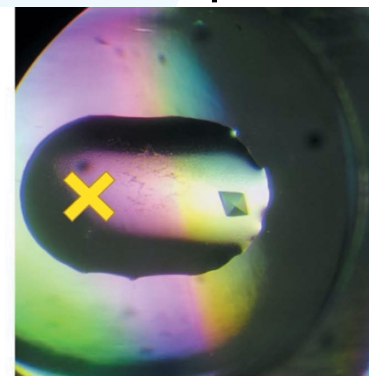


Soaking vs. Co-crystallization

- High throughput soaking: use acoustic dispensing



Allow for accurate dispensing of nanovolumes to defined positions



Add 135 nL of 100 mM ligand in DMSO to a 200 nL crystal-containing droplet

Soaking vs. Co-crystallization

- High-throughput co-crystallization: pre-coating of crystallization plates



**Dispensing
ligand
solution**



1 μ L, 10 mM
in 100 % DMSO



**Solvent
evaporation**



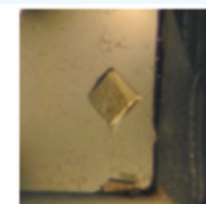
1-2 days at RT



**Dispensing
protein and
mother liquor**



**Protein
crystal
growth**



Soaking vs. Co-crystallization

- High-throughput co-crystallization: pre-coating of crystallization plates (1 μ l at 10 mM)

192 crystallization drops in the presence of dried fragment

82 % success rate

(95 % in absence of dried compound) .

	1	2	3	4	5	6	7	8	9	10	11	12
A	Green	Green	Green	Green	Green	Green	White	Green	Green	Green	Green	White
B	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green
C	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green
D	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green
E	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green
F	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green
G	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green
H	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green

Data collection and processing

You will need **a lot of** beamtime (about 7 days cumulated beamtime for our 940-fragments library).

Unattended automatic data collection is the way to go: MASSIF-1 beamline at ESRF (about 150 dataset/day).

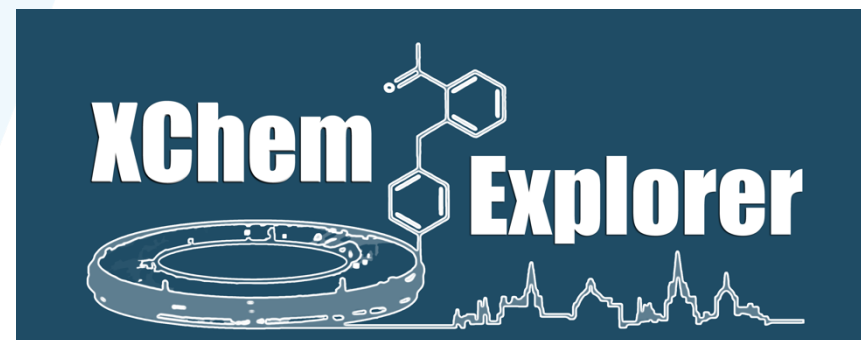
Data processing is performed automatically with various software (XDS, XDSAPP, AutoProc, GRENADES...).

Selecting the best data processing is manual...

Data collection and processing

How to keep track of everything?

Hundreds of data collection and data sets are expected....



XChemExplorer is developed at the Diamond Light Source

Usable with data from any sources... with some tweaking...

XChemExplorer

1 directory per fragment :

PICT-B01A01

PICT-B01A02

PICT-B01A03

...

...

...

PICT-B10H09

PICT-B10H10

PICT-B10H11

PICT-B10H12

reference

In each directory:

PICT-B01A01.log : aimless logfile

PICT-B01A01.mtz : MTZ with processed data

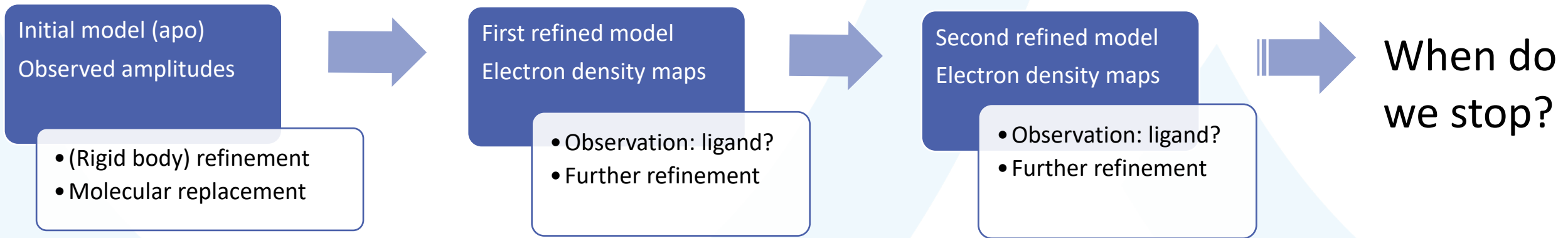
fragment.cif : fragment CIF file

In reference directory:

reference.pdb : refined apo protein structure

reference.mtz : apo protein dataset

Is a ligand present in the structure?



if (ligand) = yes then keep on refining
If (ligand) = no then

1. keep refining, but how long?
2. discard the structure... but what if?

dimple (CCP4)

pipedream (GlobalPhasing)

- Data processing (pipedream)
- Consistent indexing with reference, rigid-body/molecular replacement, restrained refinement (both)
- Analyse electron density maps (both)
- Build ligand and further refine (pipedream)

Is a ligand present in the structure?

Hopefully, XCE can automate the dimple process...

For each folder, if MTZ file present:

- Check indexing (`reference.mtz`)
- Rigib-Body refine (MolRep if needed)
- Perform restrained refinement (`refmac`)
- Compute maps and search for large peaks
- Score the peak (if any)

Latest version of XCE also handles pipedream!

PICT-B01A01
PICT-B01A02
PICT-B01A03
...
...
...
PICT-B10H09
PICT-B10H10
PICT-B10H11
PICT-B10H12
reference

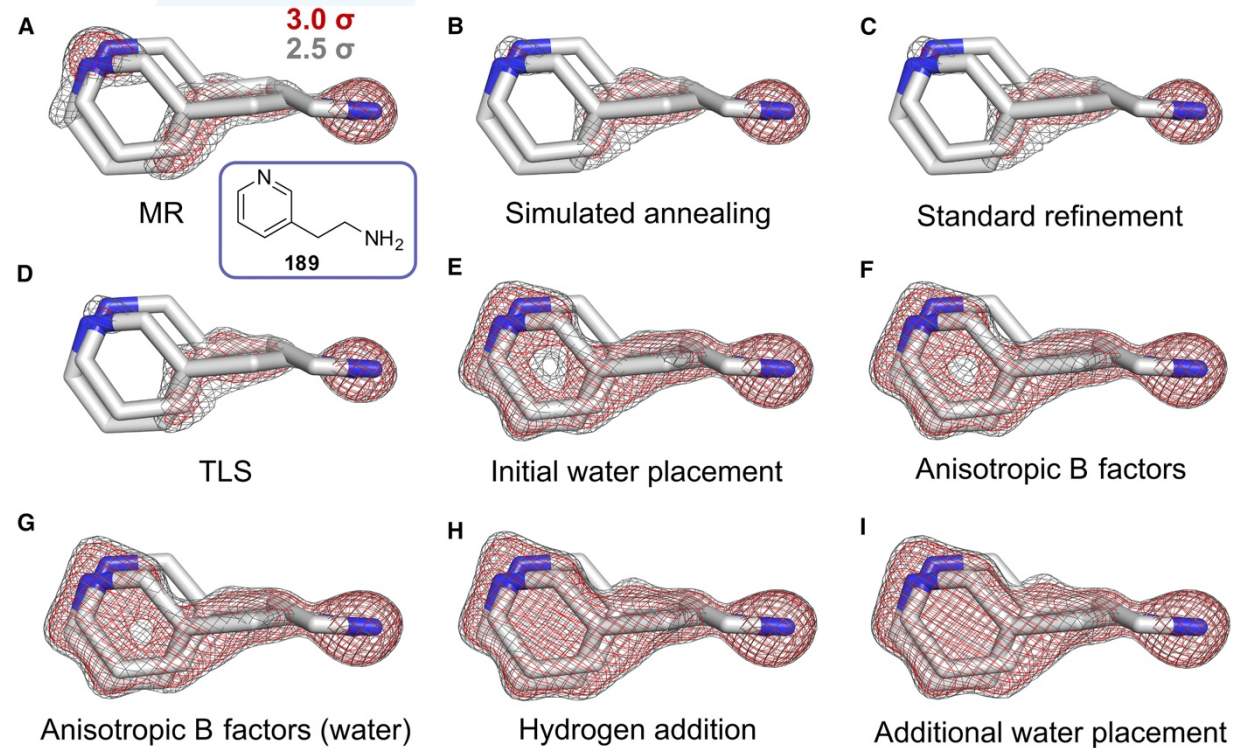
Is a ligand present in the structure?

2Fo-Fc,
1sig

Nothing to be
seen...
Discard?

Fo-Fc,
3sig

Difference map for ligand at
various refinement stage...



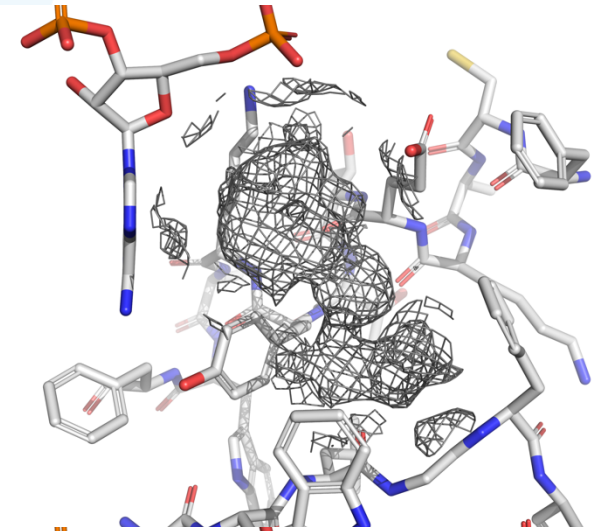
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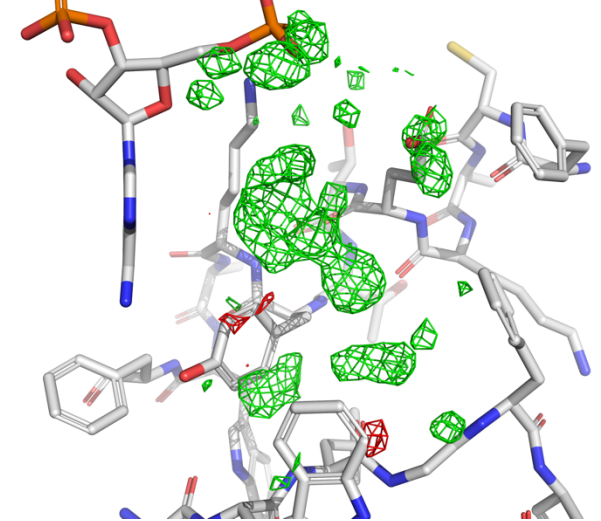
2Fo-Fc,
1sig

What a
Panda
sees...

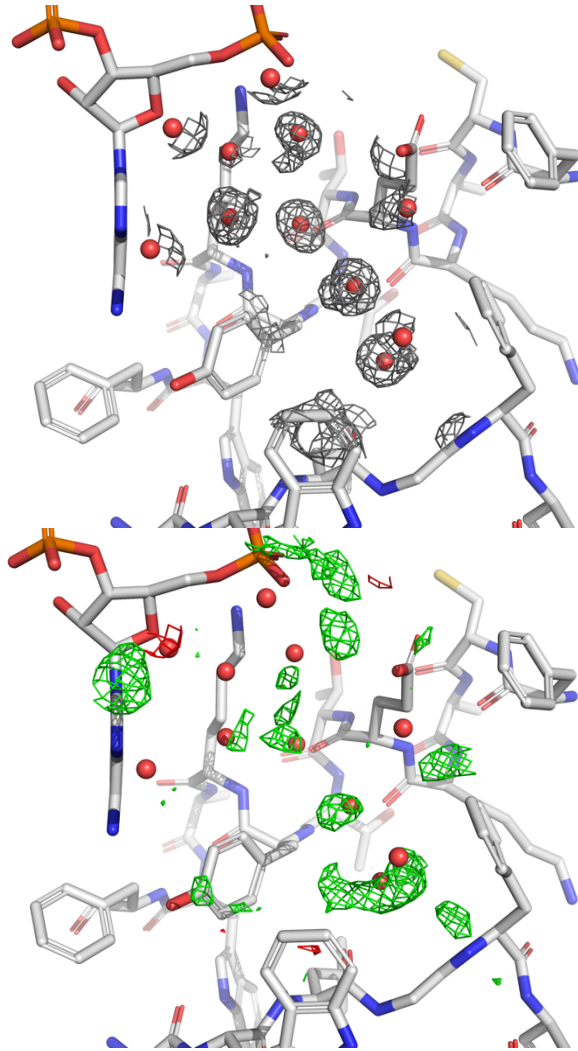
Event
map



Z-map

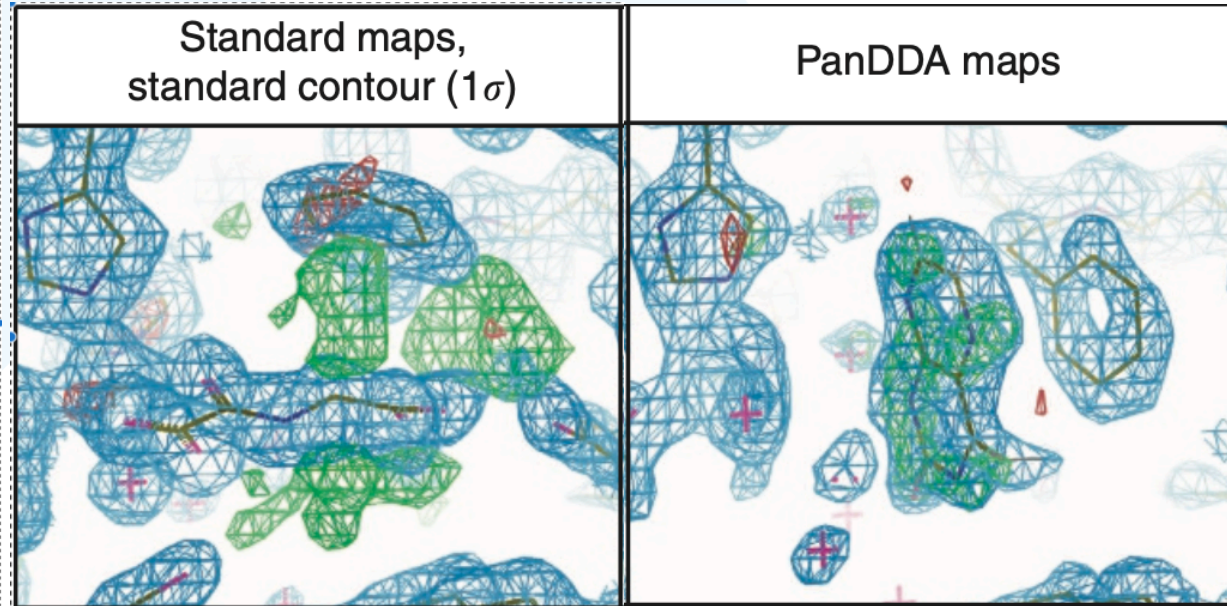
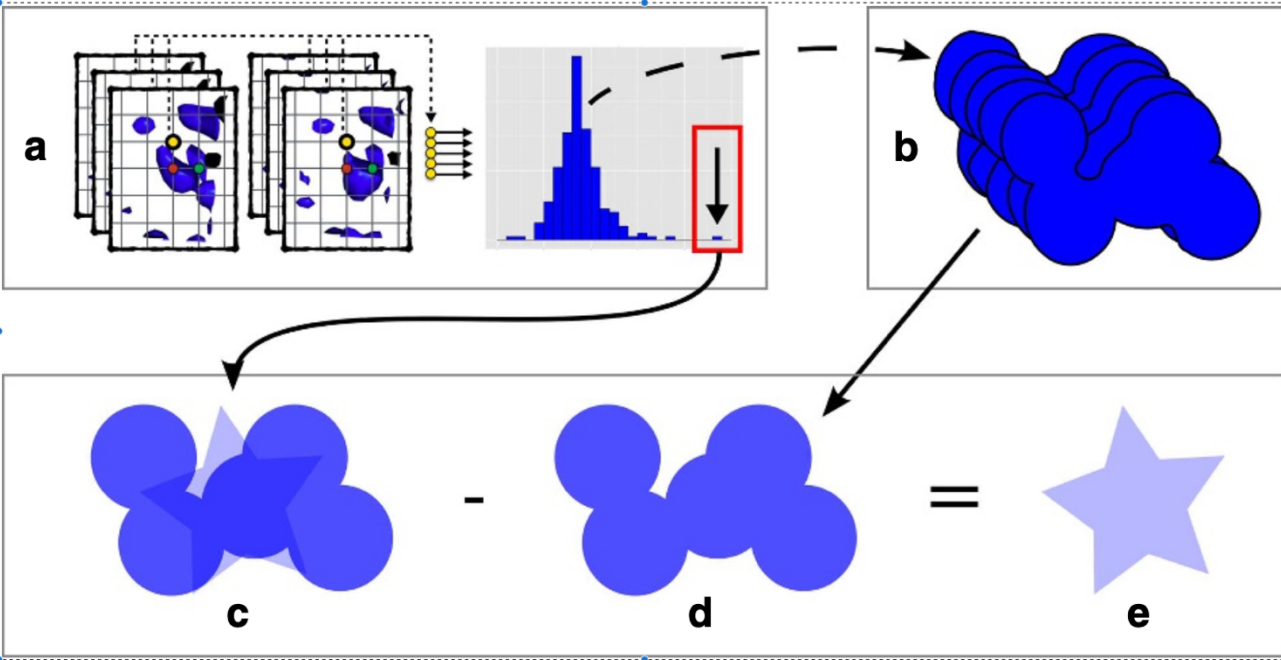
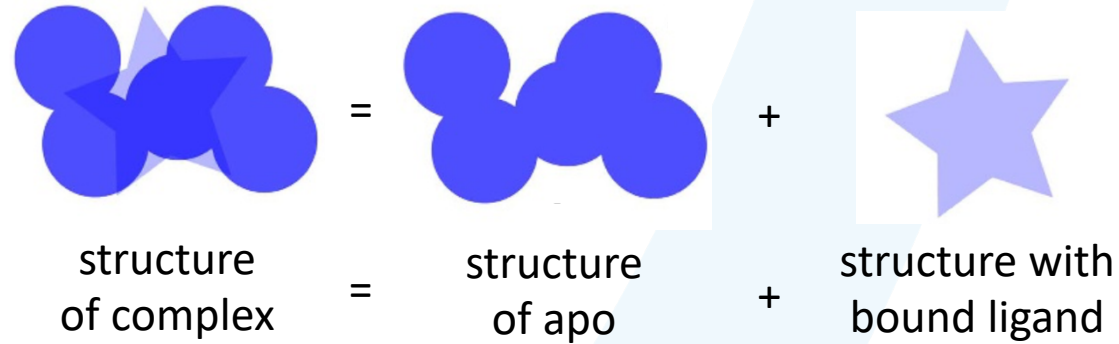


Fo-Fc,
3sig



What
you
see...

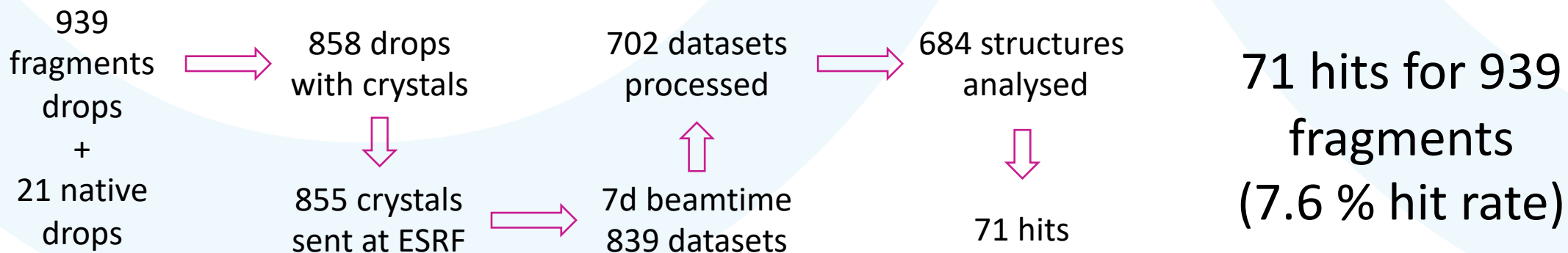
How does Pandda work?



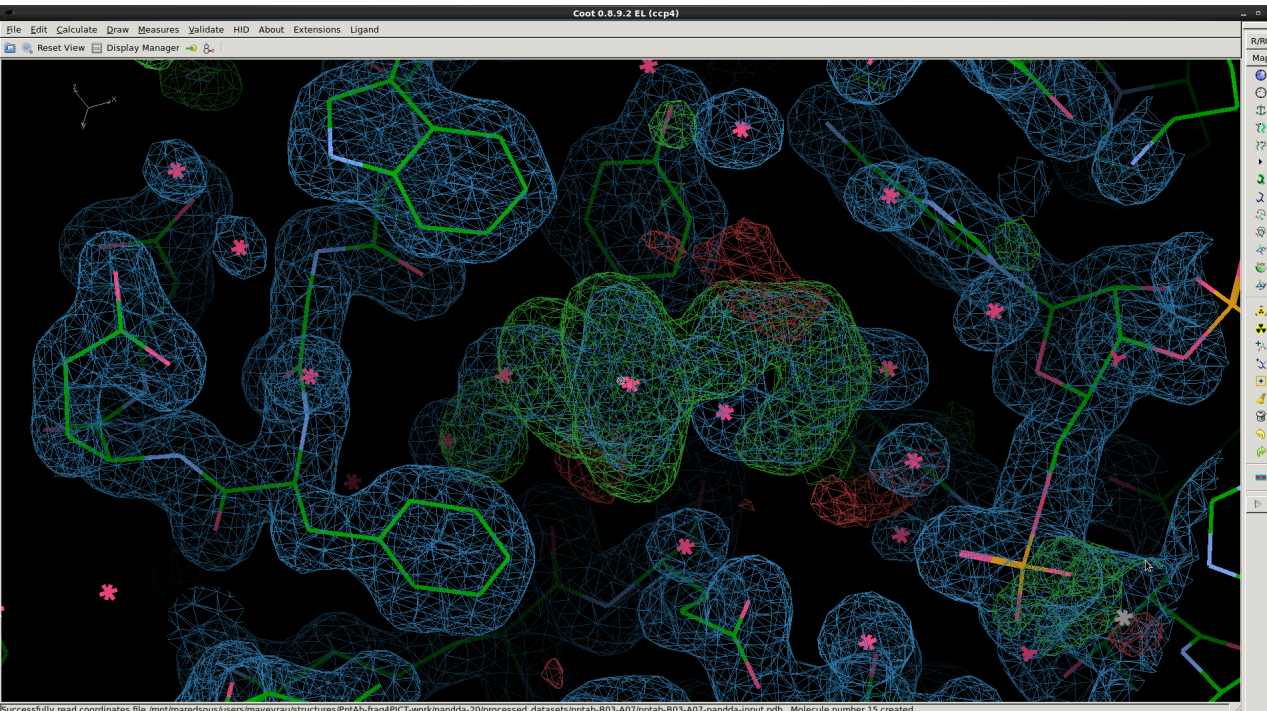
Pandda – real life example

The project:

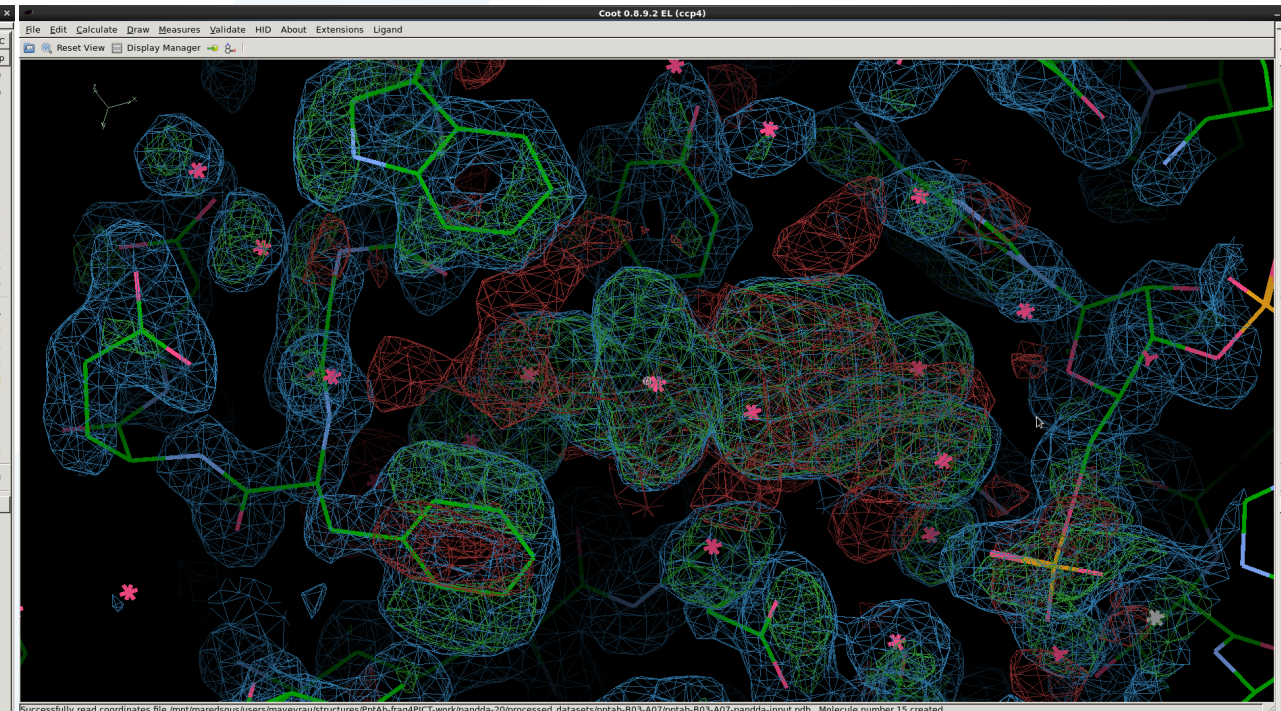
- Target: essential enzyme from *Mycobacterium abscessus*, apo structure includes CoA, 2 Mn²⁺ ions
- 939 fragments (PICT fragment library)



Pandda in real life: the good...



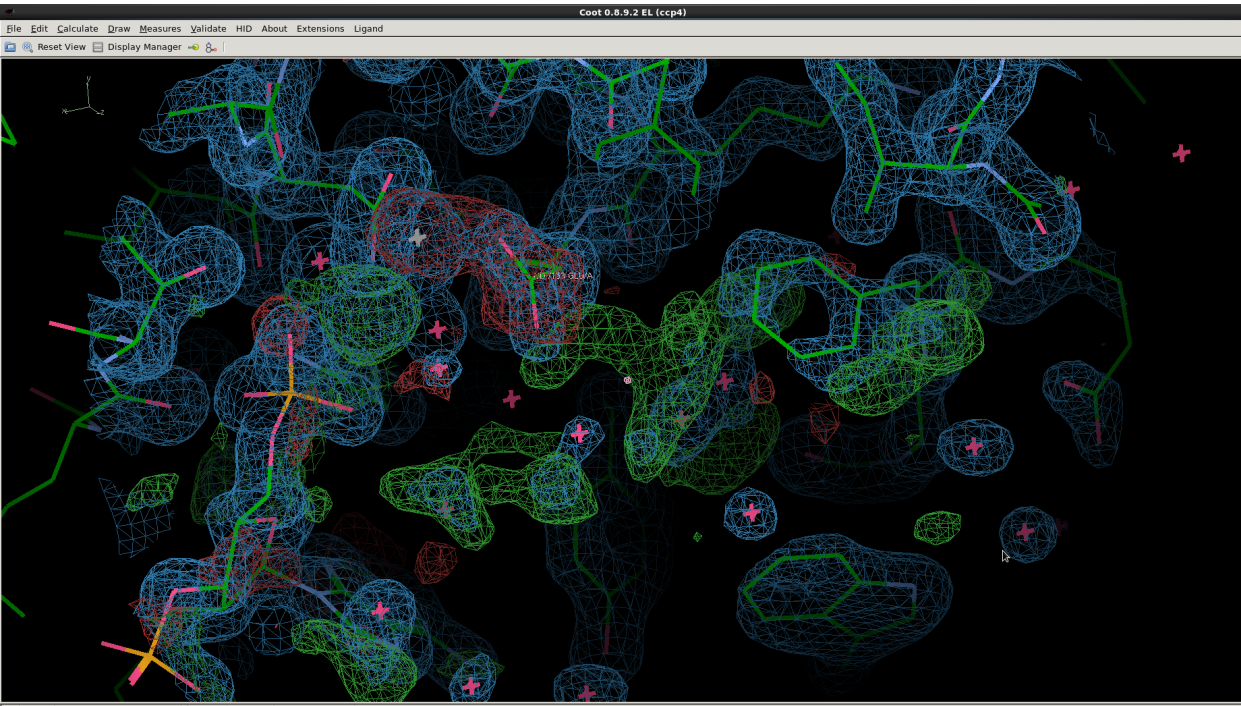
The dimple **Fo-Fc map**: presence of the ligand obvious, despite minute refinement.
=> Binding with high occupancy



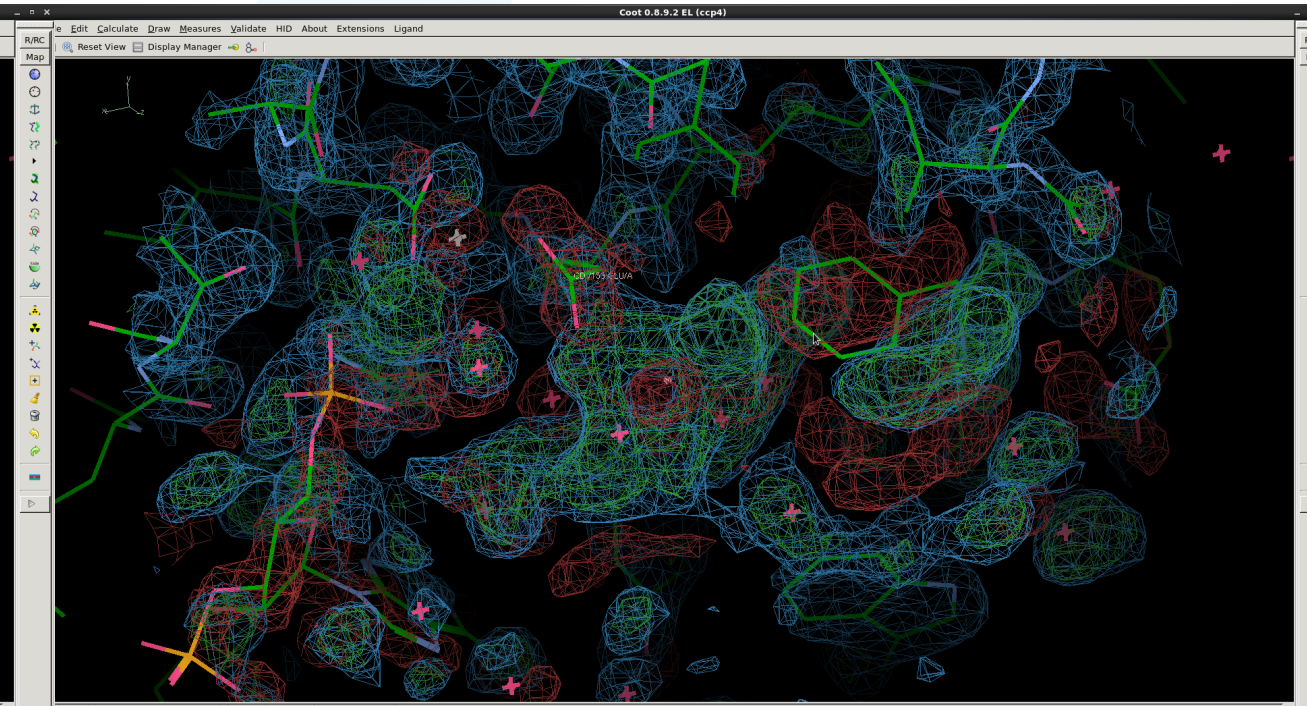
The Pandda **event map**: presence of the ligand is also obvious



Pandda in real life: the bad...



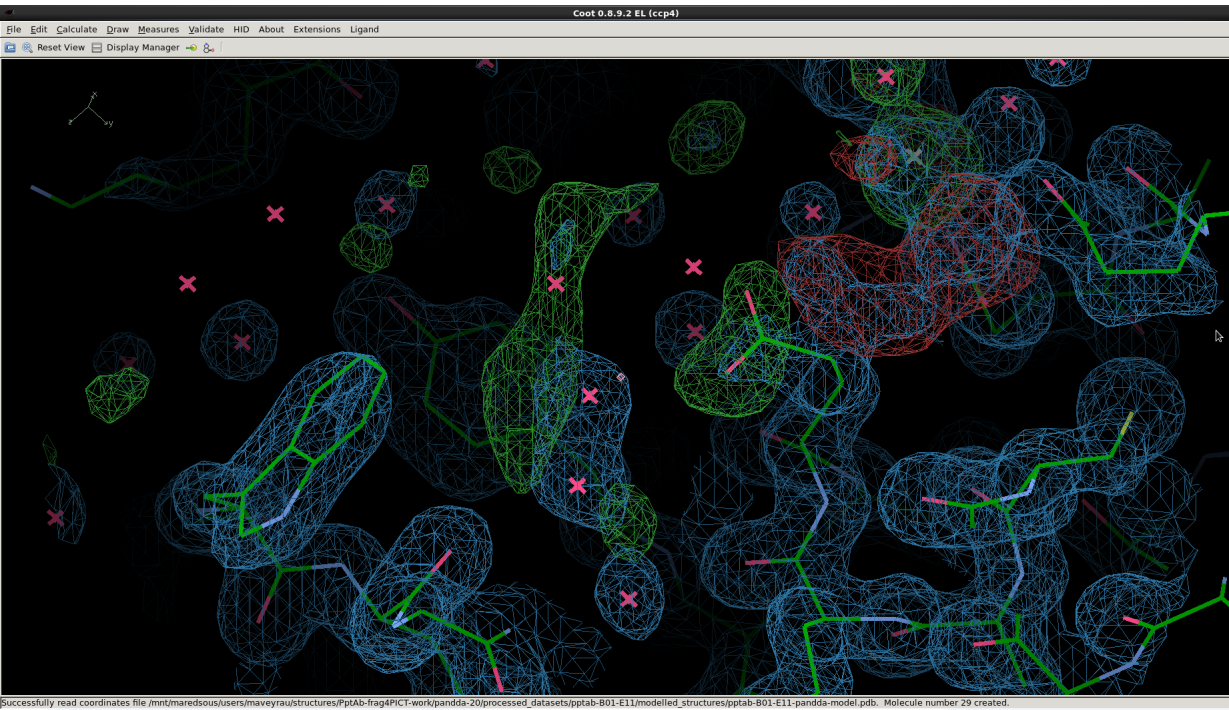
The dimple **Fo-Fc map**: presence of the ligand is possible, but impossible to build



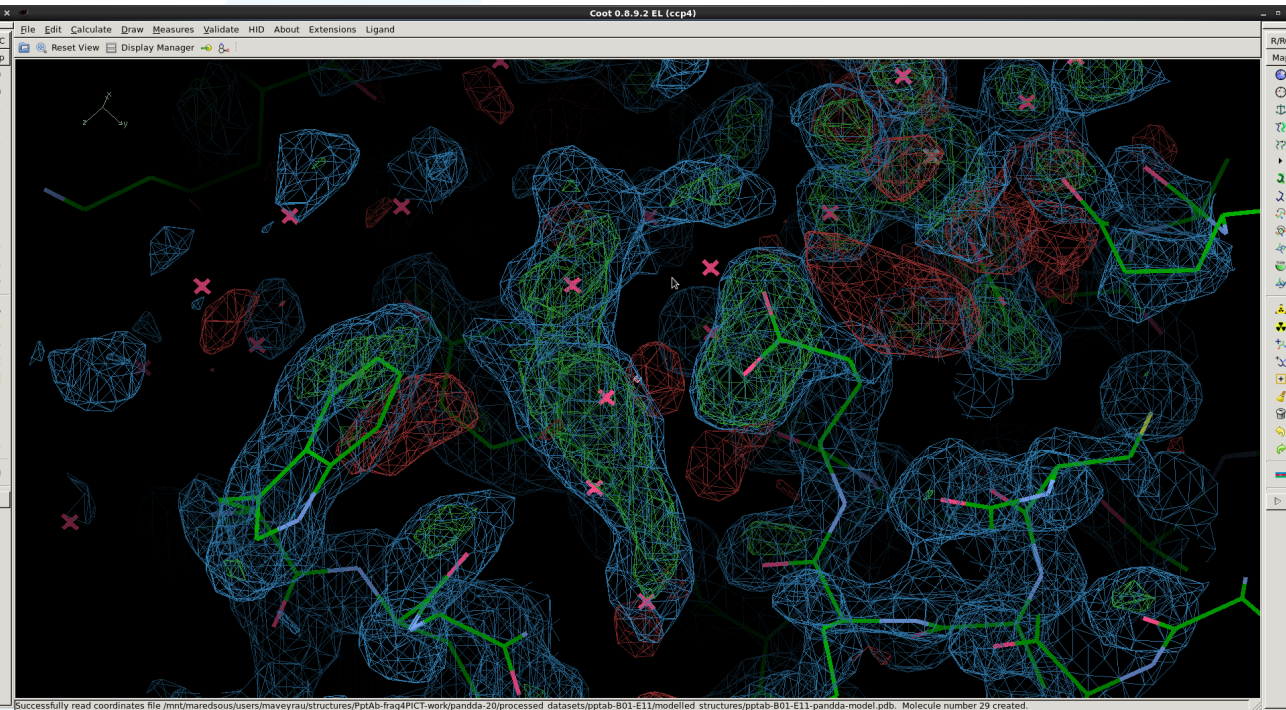
The Pandda **event map**: presence of the ligand is obvious, easily built
=> Binding with low occupancy



Pandda in real life: and the ugly.



The dimple **Fo-Fc map**: seeing a ligand there would be highly optimistic!

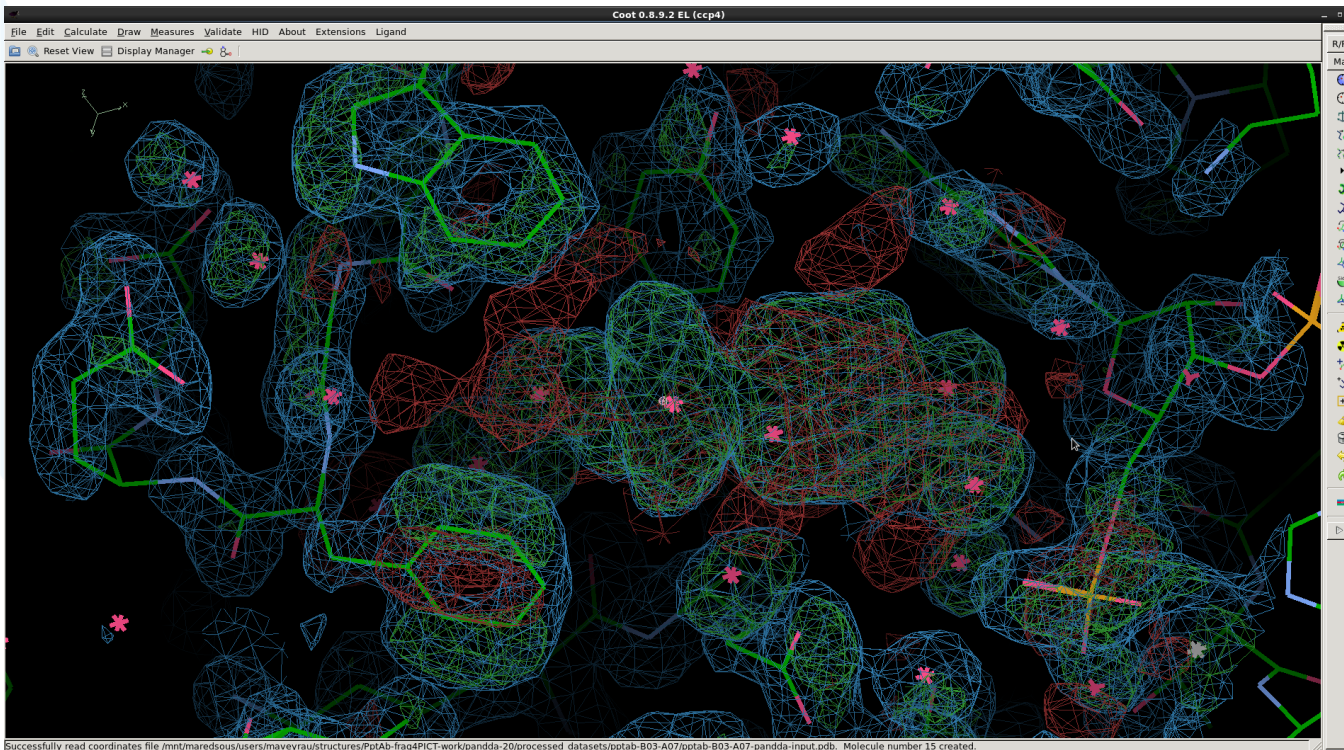


The Pandda **event map**: something is there... But impossible to build the ligand with confidence!



Pandda in real life

The Pandda / Coot / XCE interface



PANDDA inspect

Quit Overall Inspection Event/Site Progress: Go to Dataset: Go

Summary Event 6 of 212 <<< Go to Prev Site <<< >>> Go to Next Site >>>

Update HTML Site 1 of 10 >>> Go to Next Unviewed >>> >>> Go to Next Modelled >>>

<<< Prev <<< (Don't Save Model) >>> Next >>> (Don't Save Model) >>> Next >>> (Save Model)

Dataset ID		pptab-B03-A07	
Event Information:		Dataset Information:	
Event #	1	Resolution	1.53
1 - BDC	0.21	Map Uncertainty	0.22
Z-blob Peak	45.5	R-Free / R-Work	0.173 / 0.204
Z-blob Size	875	-	-

Merge Ligand With Model Save Model

Move New Ligand Here Reload Last Saved Model

Open Next Ligand Reset to Unfitted Model

Record Event Information (this event only)

Event Comment: None

Mark Event as Interesting Ligand Placed Model: High Confidence

Mark Event as Not Interesting No Ligand Placed Model: Medium Confidence

Model: Low Confidence

Record Site Information (for all events with this site)

Name: None

Comment: None

Miscellaneous buttons Load input mtz file Load average map Load unfitted model (for comparison only) Create new ligand

Display Manager

Maps All

16	pptab-B03-A07-z_map.native.ccp4	<input checked="" type="checkbox"/> Display <input type="checkbox"/> Scroll	Properties Delete Map
17	pptab-B03-A07-event_1_1-BDC_0.21_map.native.ccp4	<input checked="" type="checkbox"/> Display <input type="checkbox"/> Scroll	Properties Delete Map
18	dimple.mtz FWT PHWT	<input type="checkbox"/> Display <input checked="" type="checkbox"/> Scroll	Properties Delete Map

Molecules All Last Only

15	pptab-B03-A07-pandda-input.pdb	<input checked="" type="checkbox"/> Display <input checked="" type="checkbox"/> Active	Bonds (Colour by Atom) Delete Model
----	--------------------------------	--	-------------------------------------

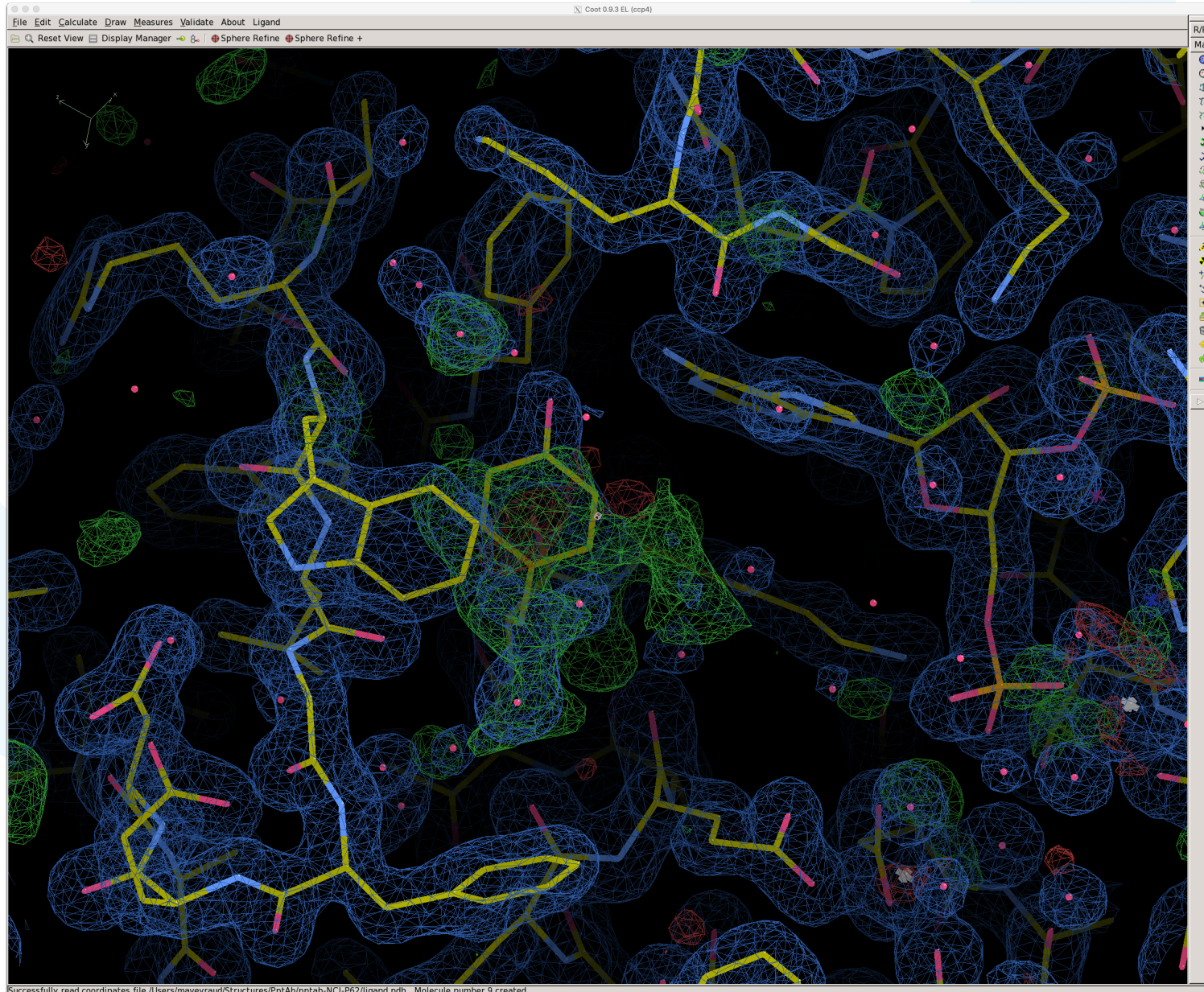
Close

Pipedream

Perform refinement as thoroughly as possible before checking for presence of a ligand... :

- In the penultimate refinement cycle, place « dummy waters » in unmodelled density
- Groups of connected dummy water suggest possible ligand binding site
- Perform last refinement cycle without these waters: should improve difference maps

Pipedream/Pandda

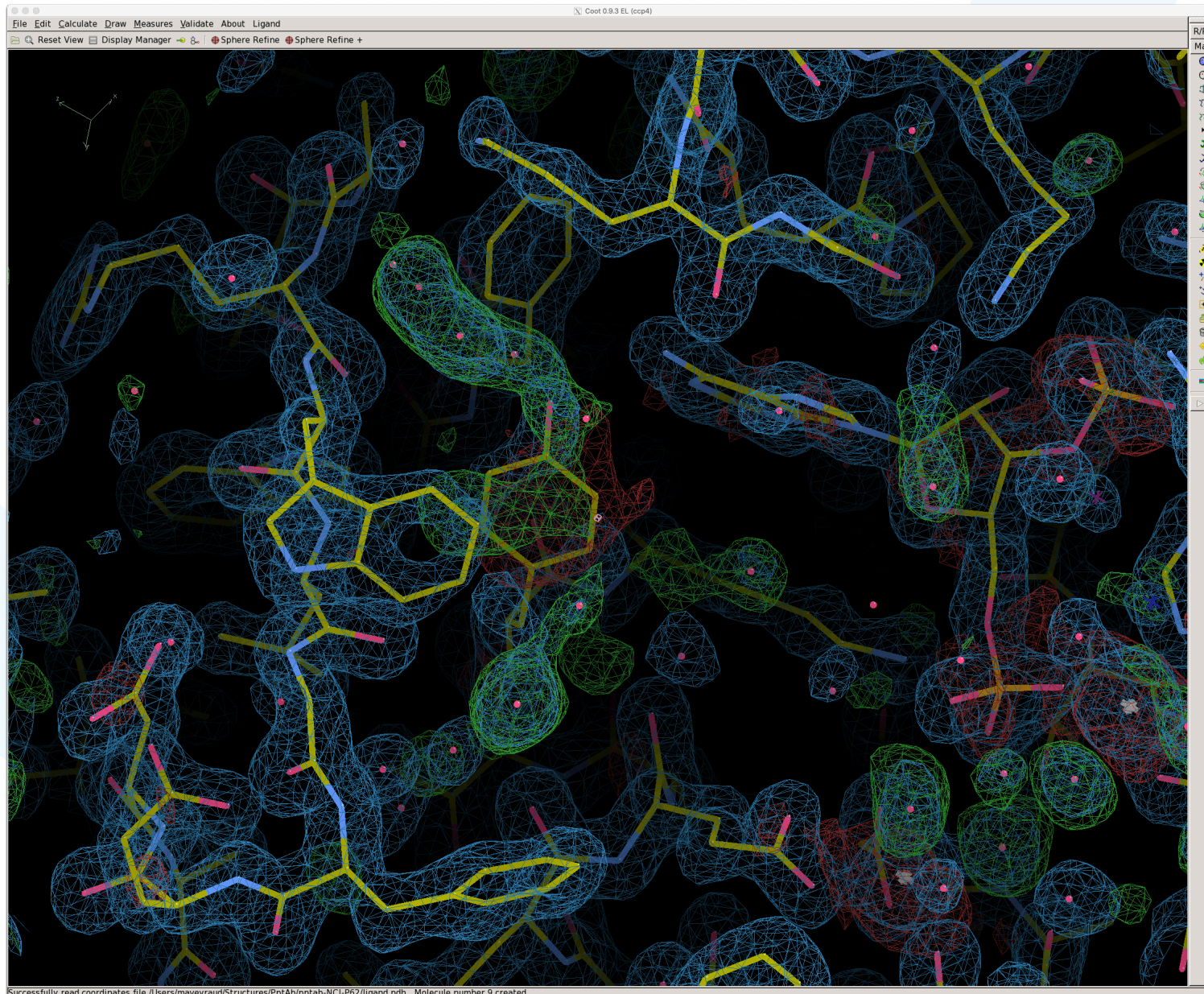


Dimple:
Resolution 1.3
R/Free : 0.1753 / 0.1960

Unpublished results



Pipedream/Pandda

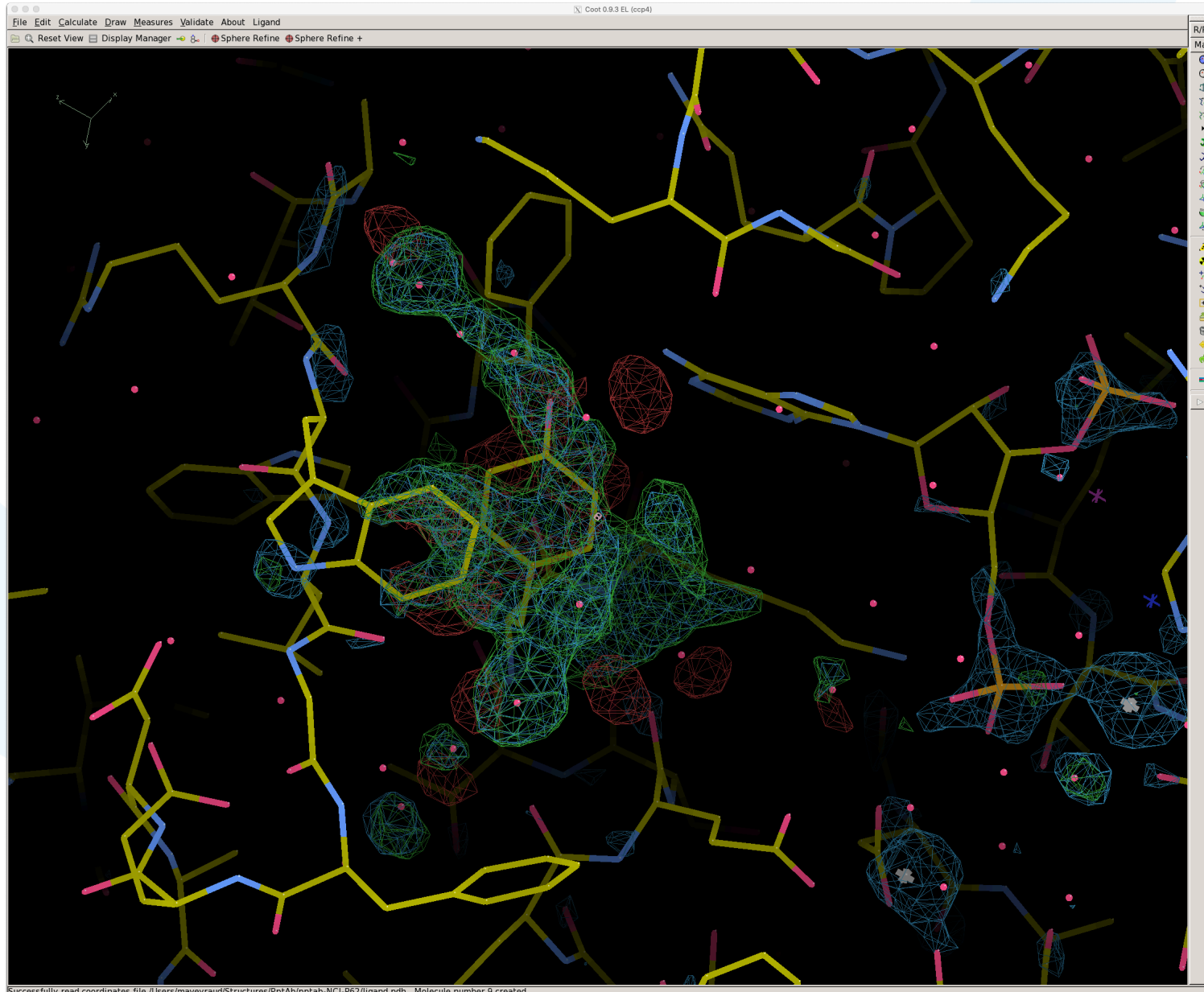


Pipedream:
Resolution 1.3
R/Free : 0.2099 / 0.2313

Unpublished results



Pipedream/Pandda

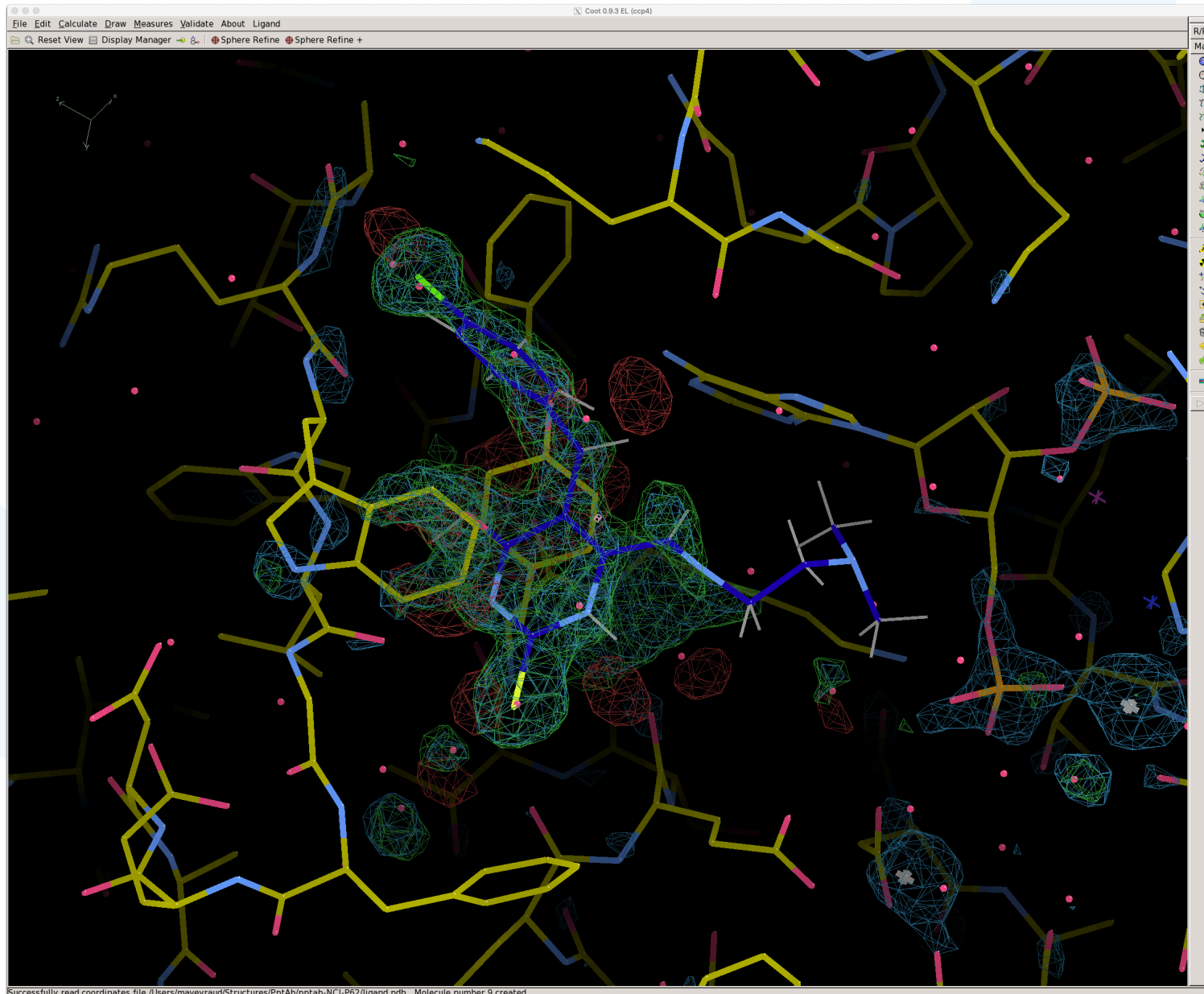


Dimple + Pandda:
Resolution 1.3
R/Free : 0.2099/0.2313

Unpublished results



Pipedream/Pandda

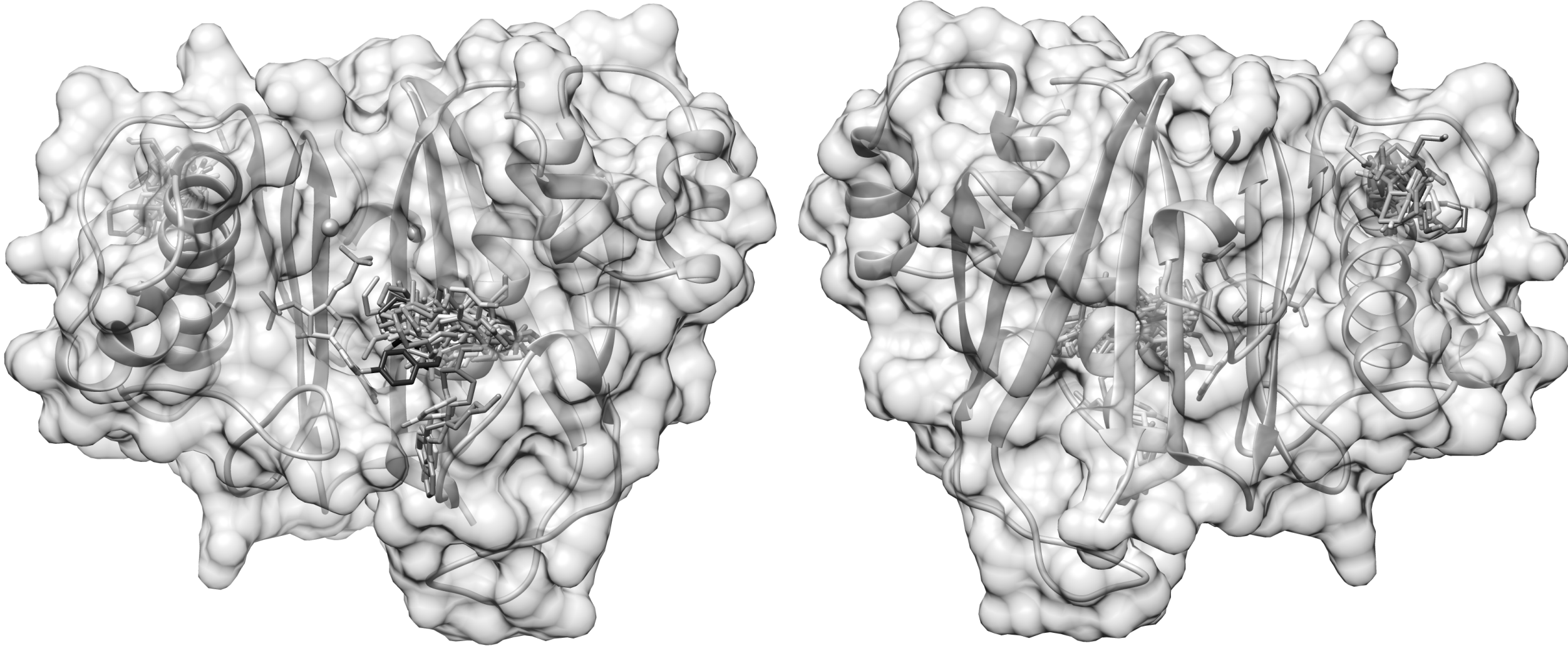


Refined ligand:
Resolution 1.3
R/Free : 0.1685 / 0.1948
Refined occupancy: 0.58

Unpublished results



939 fragments screened, 71 hits



Optimizing fragments

Fragments linking



Fragments growing



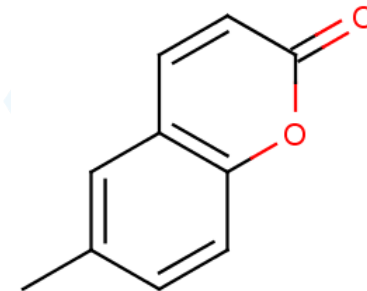
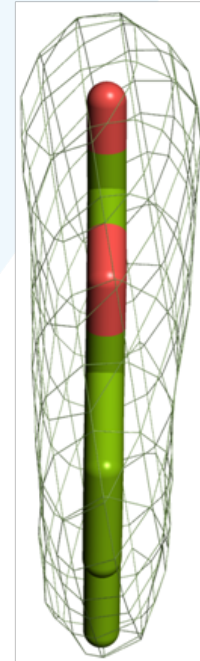
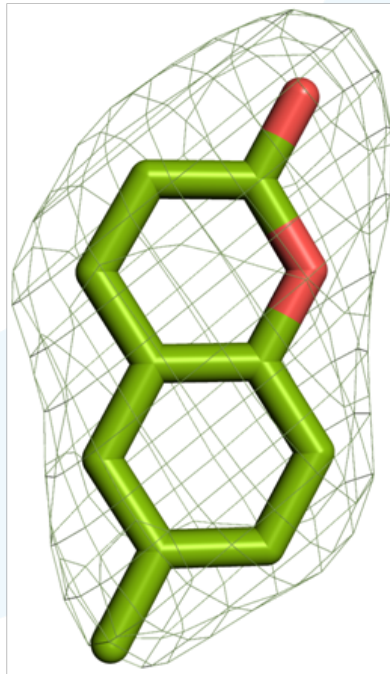
Fragments merging



Optimizing fragments

The project:

- Target: methyltransferase from *Mycobacterium tuberculosis*
- 160 fragments (commercial library)



A

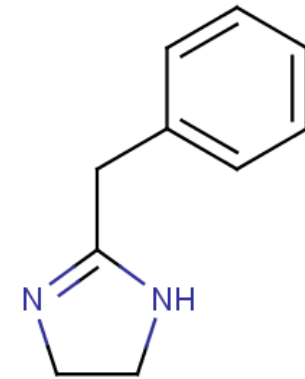
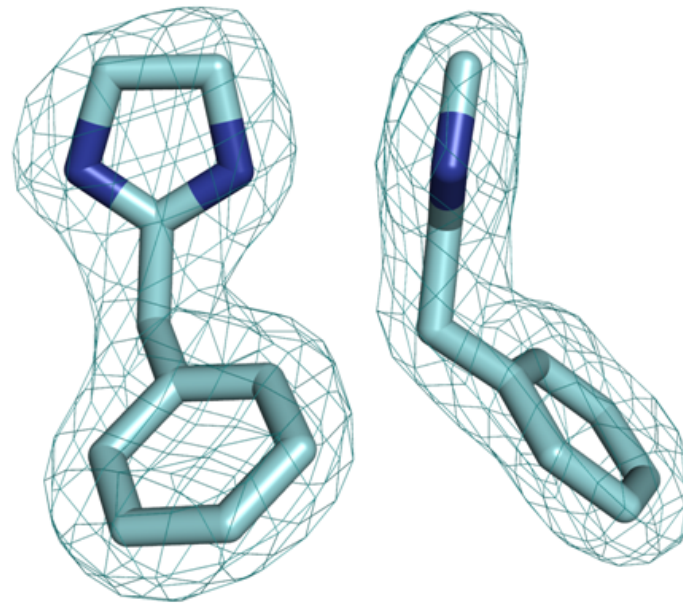
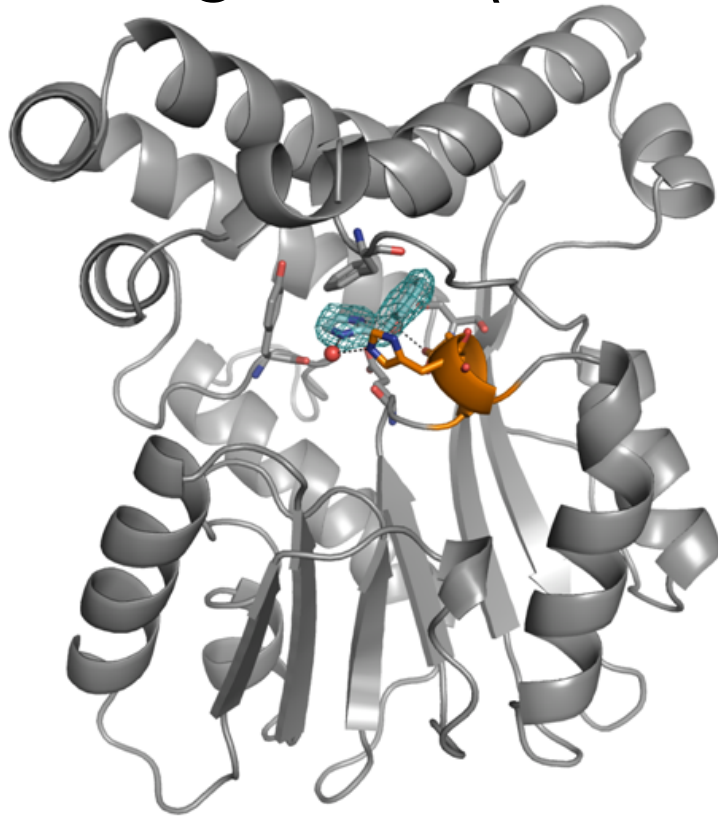
-20.9 kJ.mol⁻¹

LE = 1.74

Optimizing fragments

The project:

- Target: methyltransferase from *Mycobacterium tuberculosis*
- 160 fragments (commercial library)

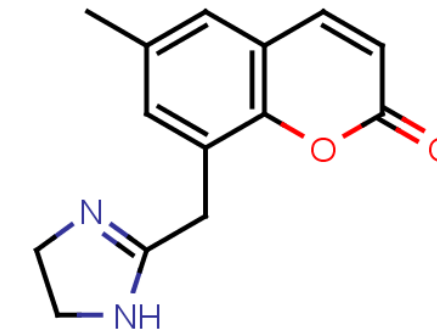
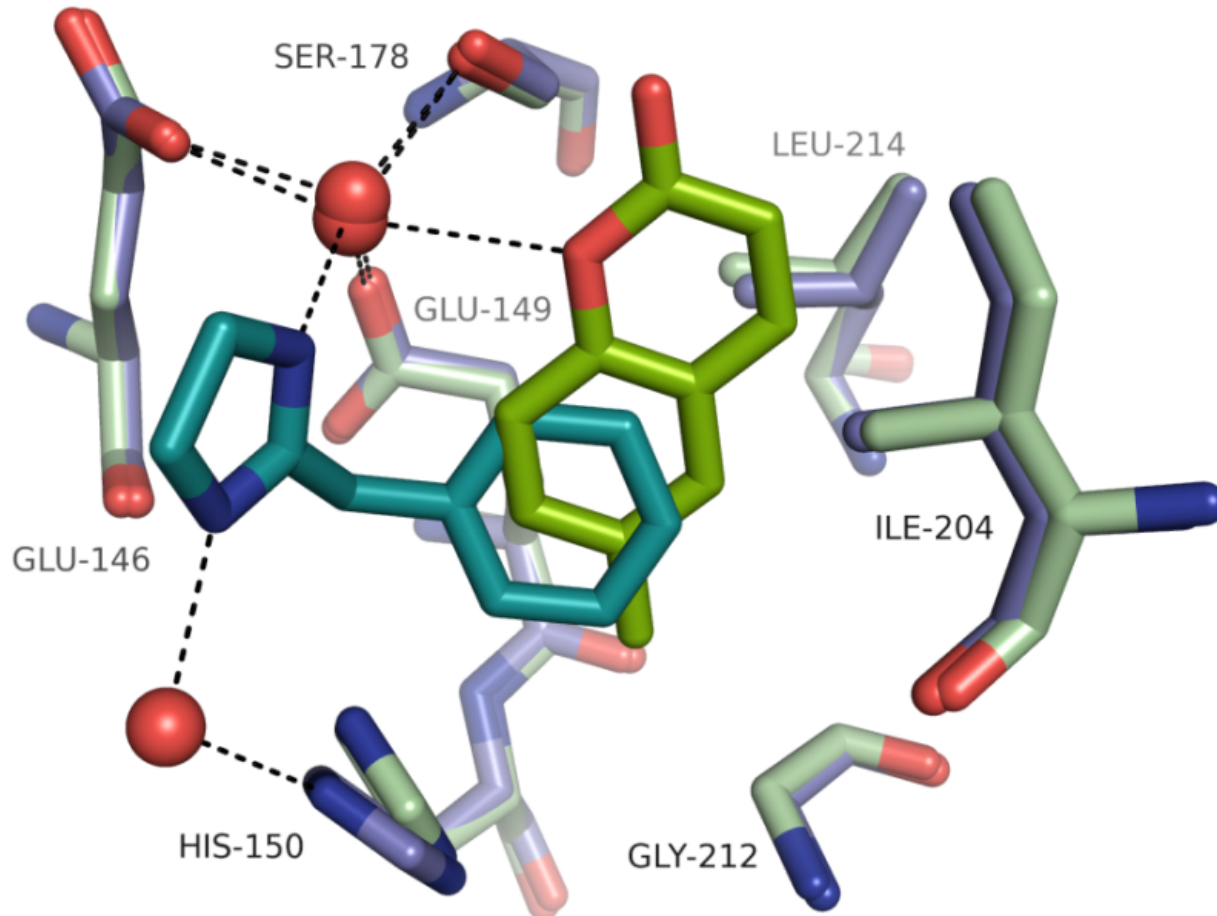


B

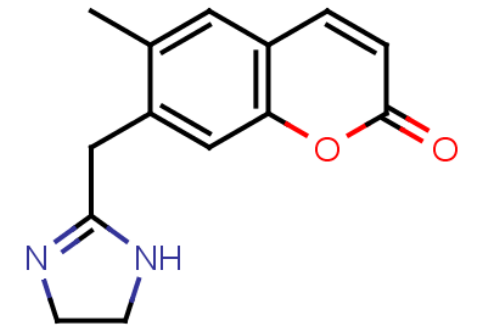
-20.7 kJ.mol⁻¹

LE = 1.73

Optimizing fragments



-26.3 kJ.mol⁻¹
LE = 1.5



-34.5 kJ.mol⁻¹
LE = 1.92

Fragments in the clinic

Approved!

<u>Erdafitinib</u> (2019)	Astex/J&J	FGFR1-4
<u>Pexidartinib</u>	Plexxikon	CSF1R, KIT
<u>Vemurafenib</u> (2011)	Plexxikon	B-RAF ^{V600E}
<u>Venetoclax</u> (2016)	AbbVie/Genentech	Selective BCL-2

Phase 3

<u>Asciminib</u>	Novartis	BCR-ABL
Lanabecestat	Astex/AstraZeneca/Lilly	BACE1
<u>Verubecestat</u>	Merck	BACE1

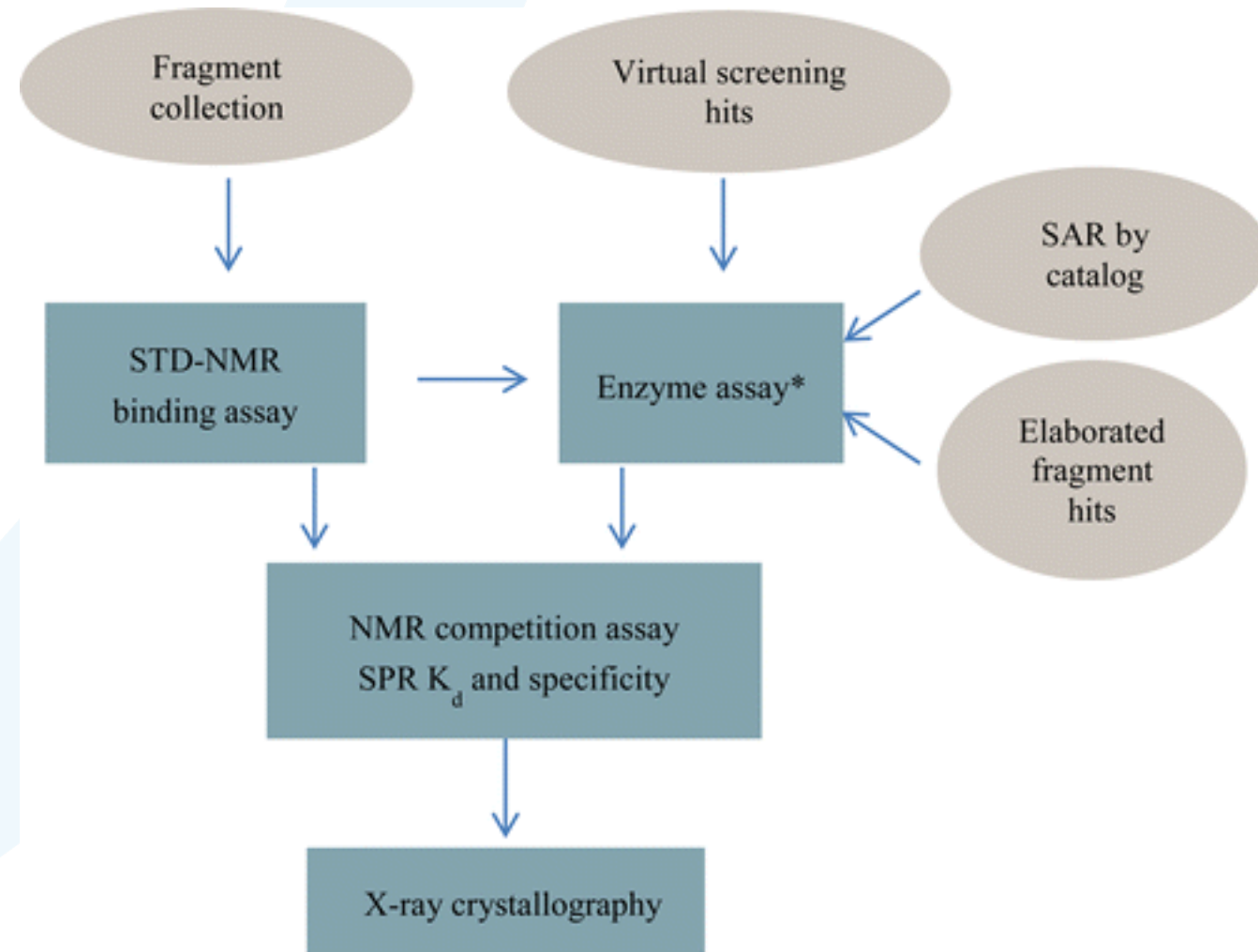
Phase 2 : 19 compounds in the pipeline

Phase 1 : 21 compounds in the pipeline

Nanomolar inhibitors of LDH

- Lactate dehydrogenase: last enzyme in the glycolytic cycle, converts lactate into pyruvate
- In cancer cells, ATP is preferentially derived from glycolysis rather than oxydative phosphorylation

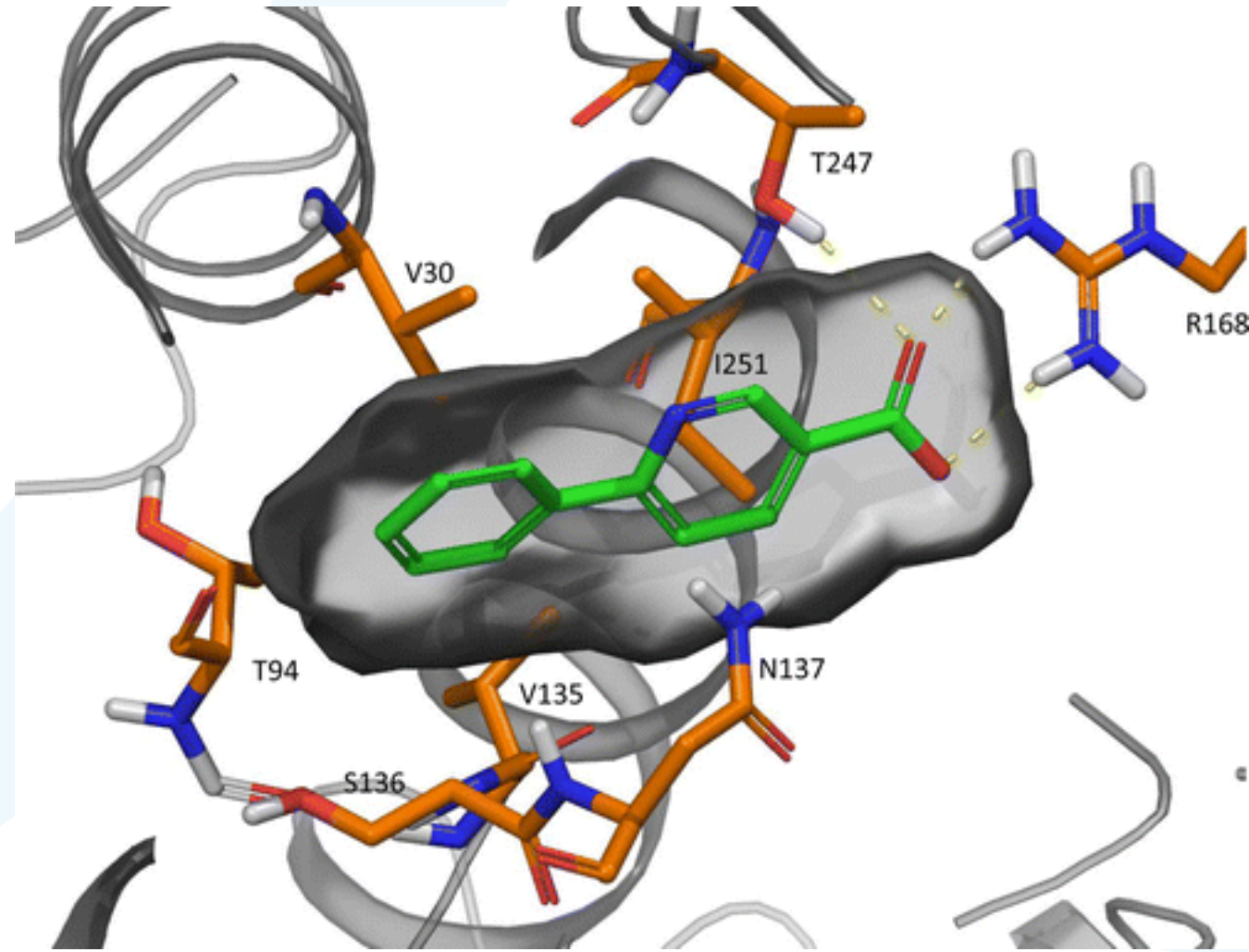
LDH is a target in anticancer therapies



Nanomolar inhibitors of LDH

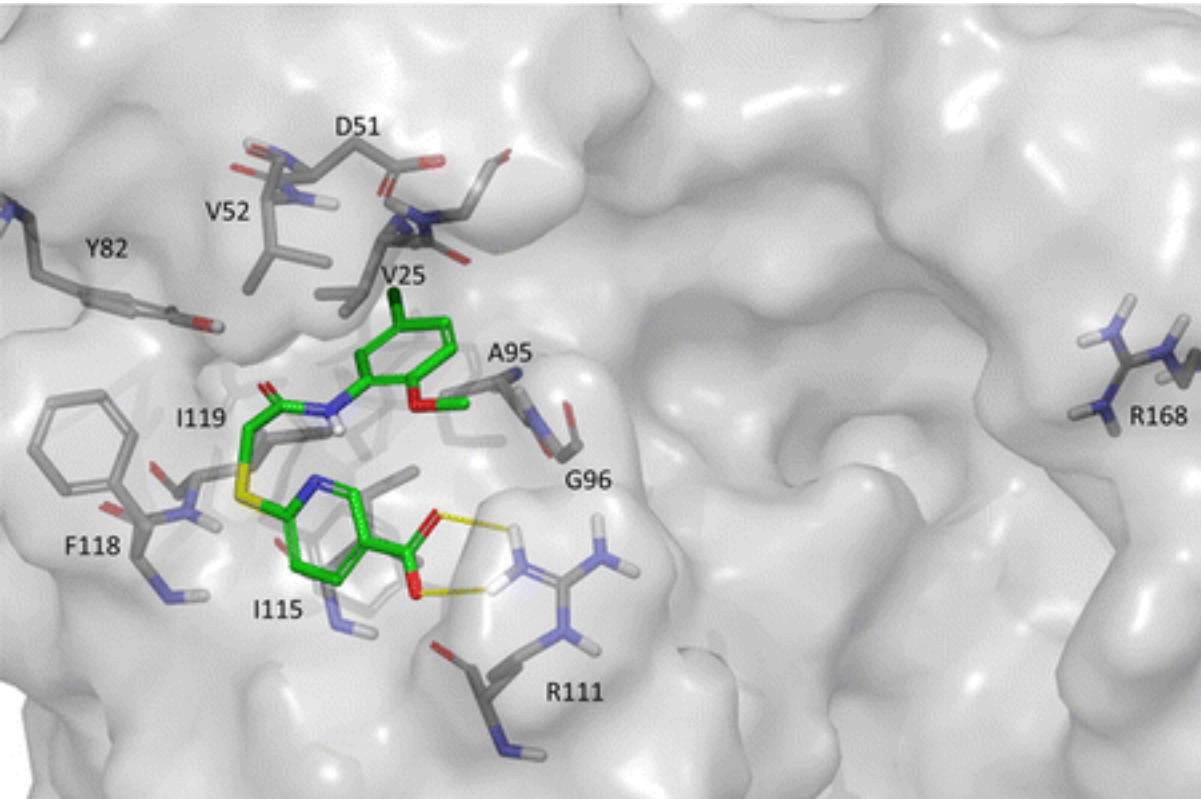
Validation of hits by SPR...
Too low K_d (1-5 nM) for SAR

X-ray structure

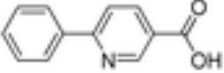
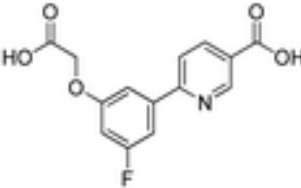
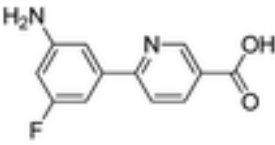
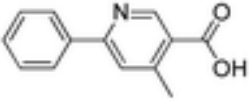
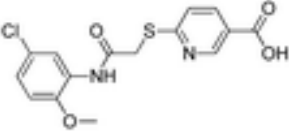
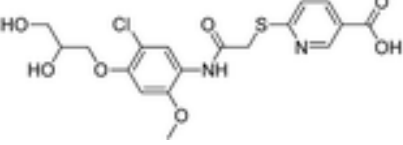


Nanomolar inhibitors of LDH

SAR by catalog

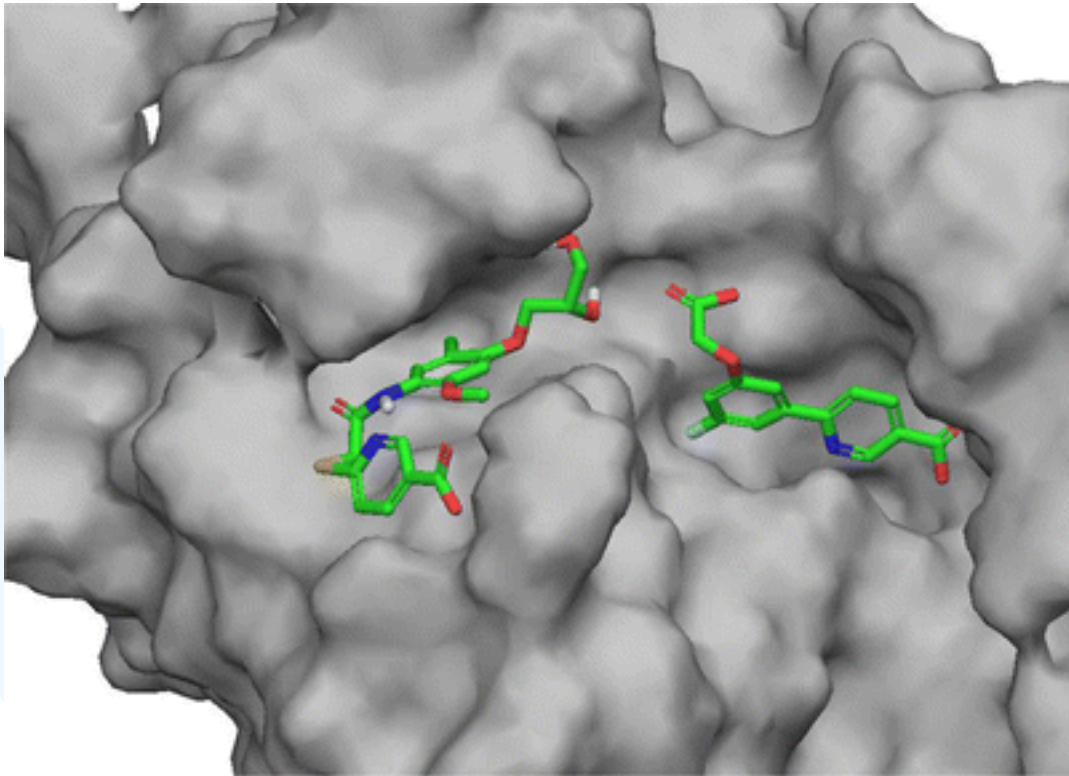


Does not bind as expected!

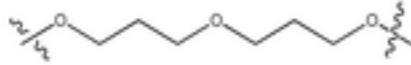
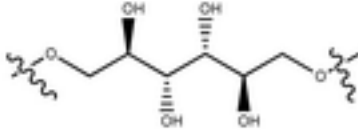
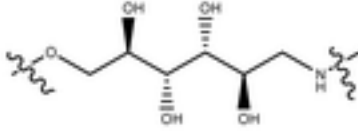
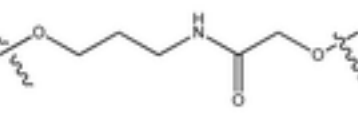
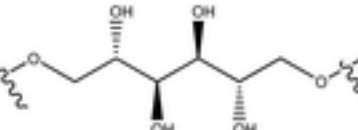
Compound	Structure	IC ₅₀ , μM	K _d , μM	LE
1		> 2000	2300	0.18
2		2200	1300	0.14
3		1300	na	
4		na	1900	0.17
5		770	137	0.17
6		342	360	0.12

Nanomolar inhibitors of LDH

Two fragments at distinct site: let's link'em

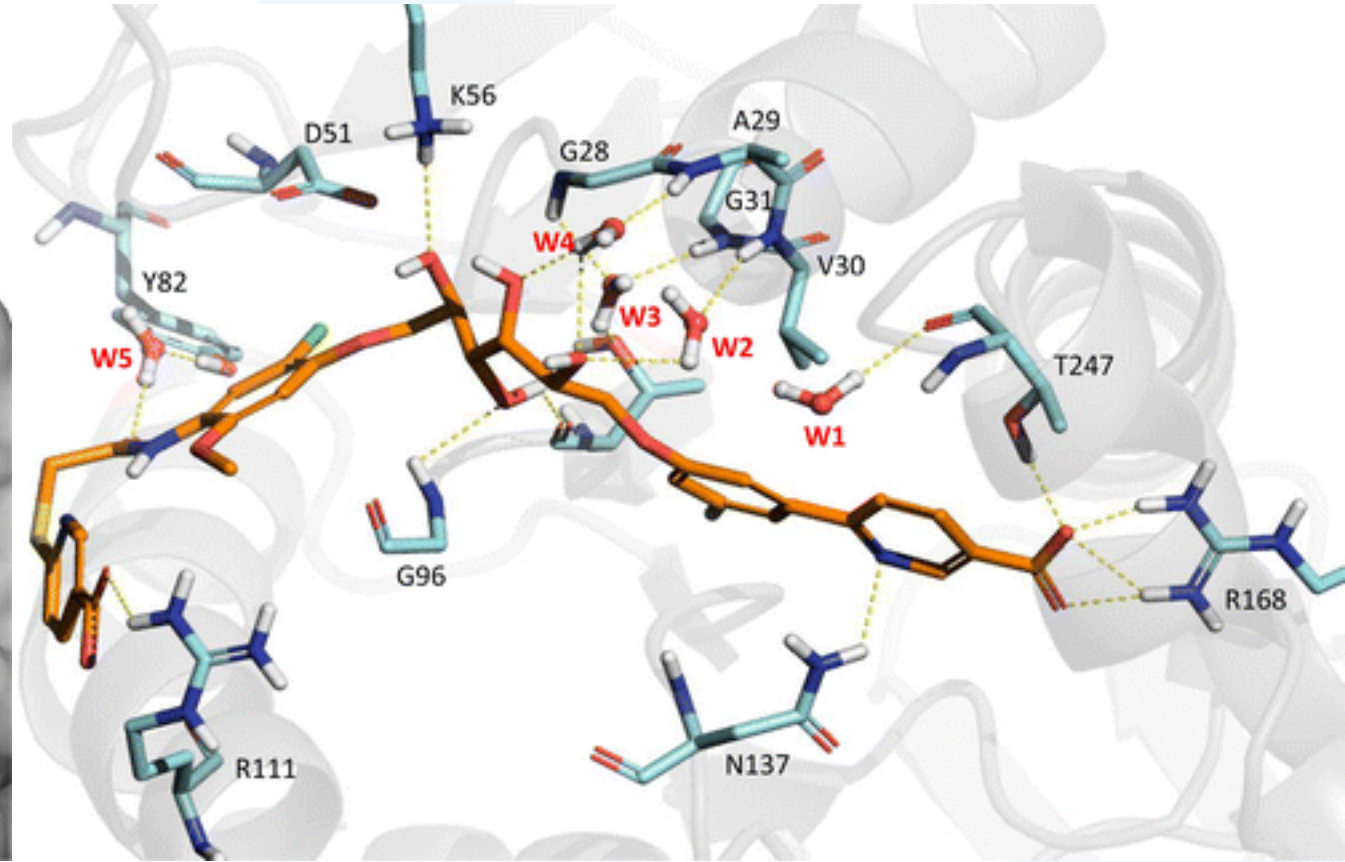
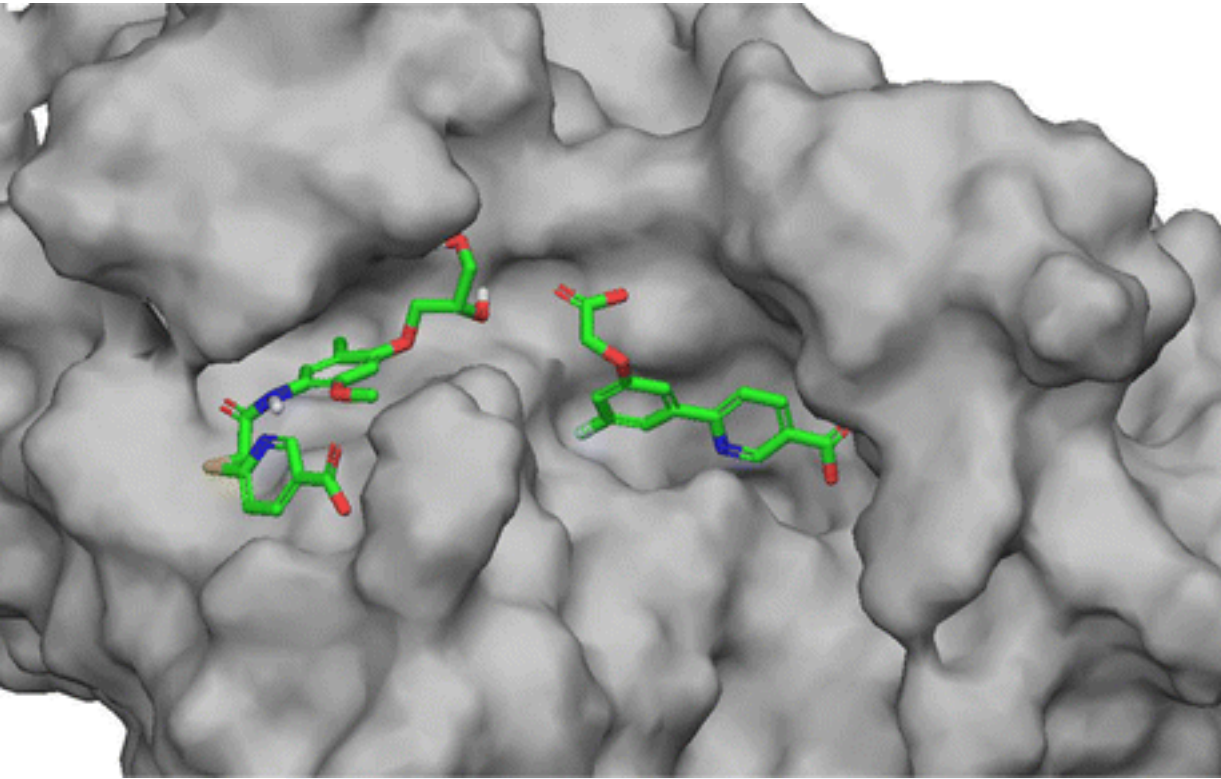


Co-soaked structure

Compound	Linker	IC ₅₀ , μM	K _d , μM	LE
7		59.0	0.850	0.13
8		0.440	0.068	0.14
9		0.120	0.019	0.15
10		2.40	0.175	0.14
11		15.2	12.0	0.10

SAR of linkers

Nanomolar inhibitors of LDH



Linked fragment binds as expected

Thank you!

PICT :

Plateforme Intégrée de Criblage de Toulouse

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Olivier Saurel (IPBS)

Yves Génisson (SPCMIB)

Magali-Rénaud Simeon (TBI)

Hma

Romain Galy (IPBS)

Sylviane Julien (IPBS)

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Yves Génisson (SPCMIB)

Jean Christophe Plaquevent (SPCMIB)

Olivier Saurel (IPBS)

Alain Milon (IPBS)

Georges Czaplicki (IPBS)

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