

**“Drug Design today ... between myth  
and reality.”**

**Stefano Moro**

**Molecular Modeling Section (MMS)**

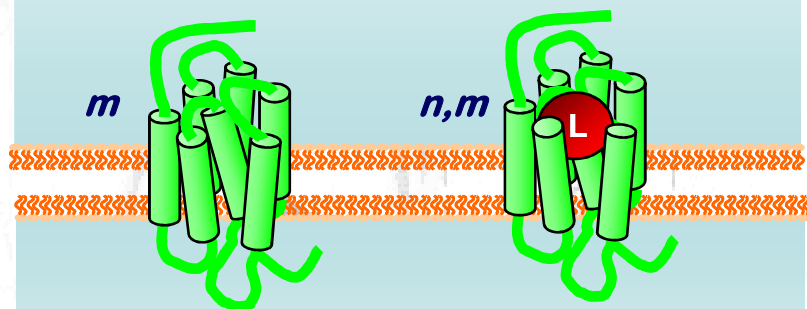
**Department of Pharmaceutical and Pharmacological Sciences**

**University of Padova**

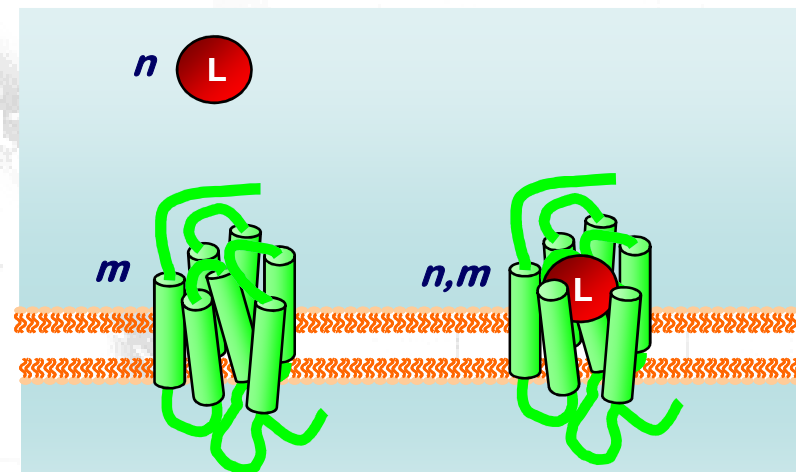
**©2018**



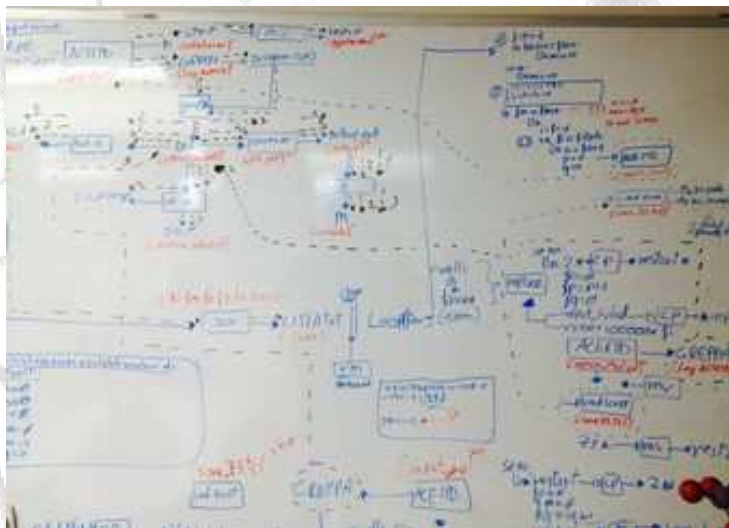
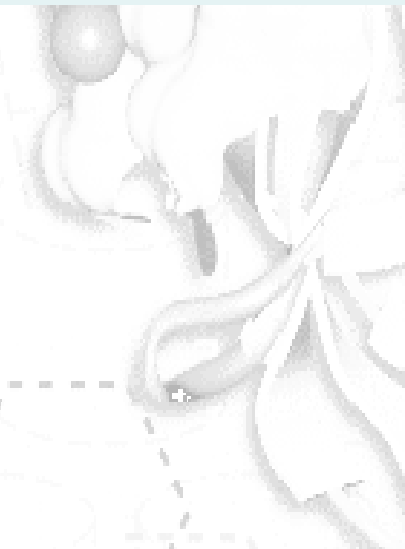
# From a molecular point of view, of course!



Select the best binder!



Understand how it became a binder!



MMStools

Back when I was young:

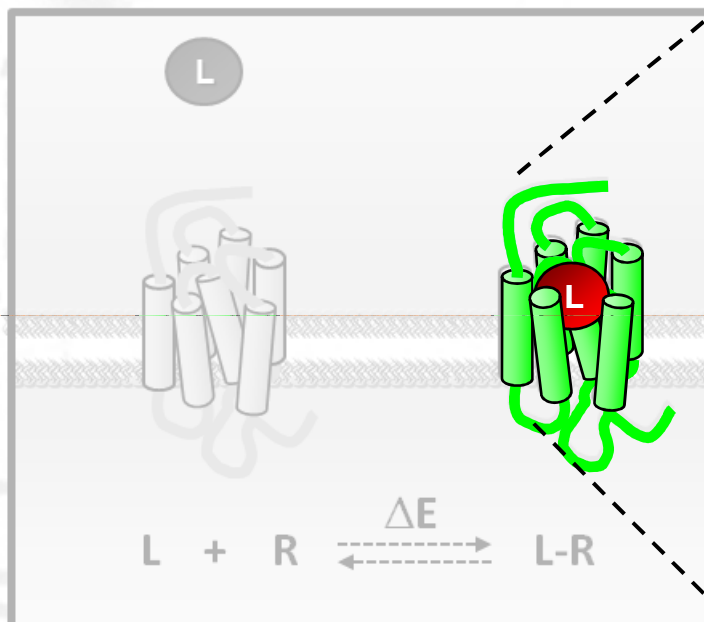
“It is generally accepted that receptor and substrate molecules recognize each other at their molecular surfaces. Therefore, the binding strength of a receptor-drug complex depends on the shape of the substrate surface and on the distribution of certain properties on this surface. Any method attempting to model biological activity should take into account this information and try to correlate it to biological activity...”

by Johann Gasteiger *et al* *J.A.C.S.* 1995, 117, 7769-7775

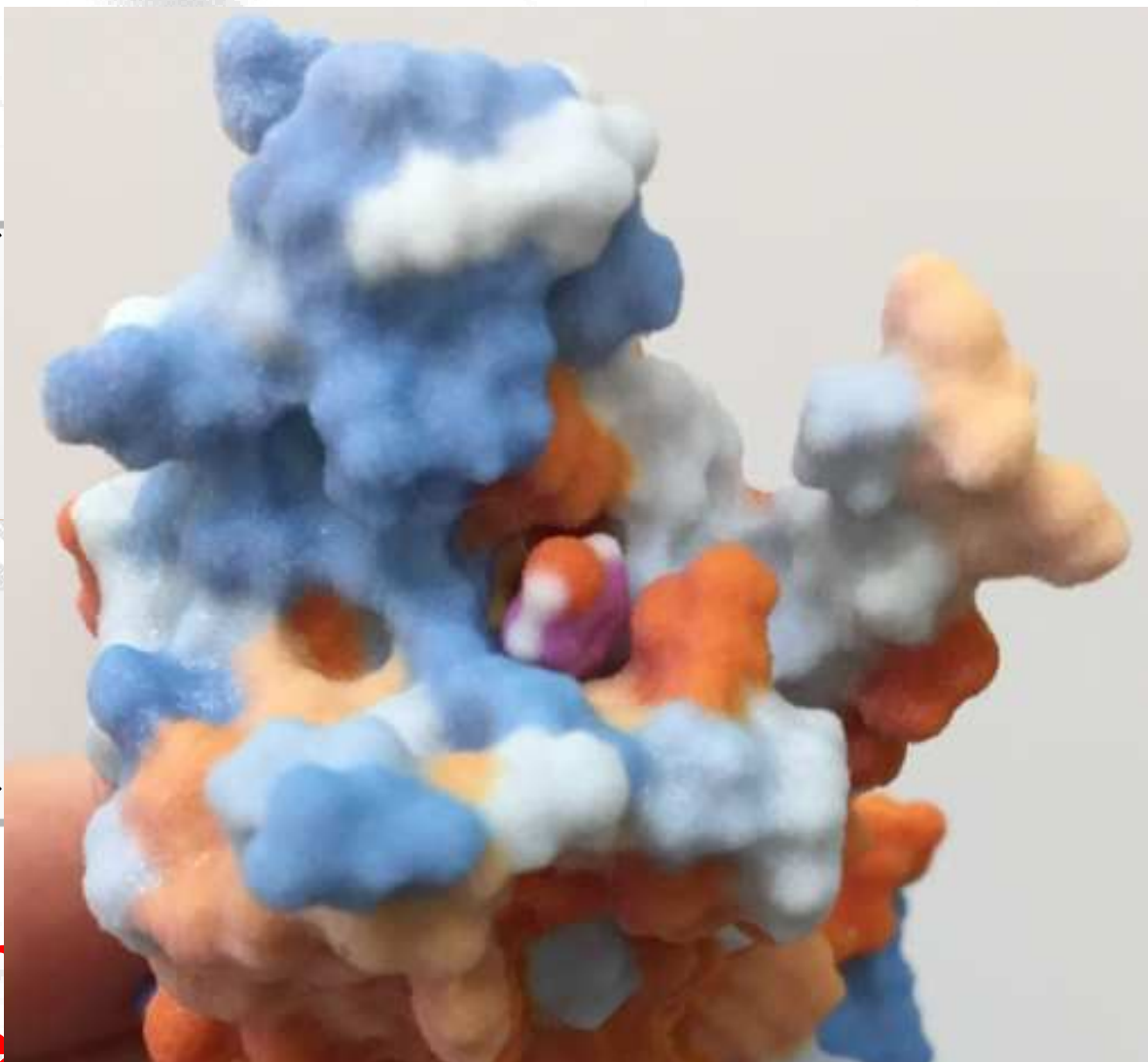


## Why X-ray structures are computationally exciting...

Single event



*closed system,  $T$  constant.*



The natural link with  
a ligand-receptor recognition process.

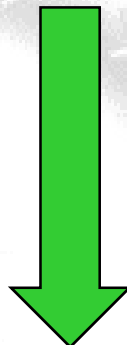
MMS Lab (2015): 3D printed model of the human A2A adenosine receptor co-crystallized its antagonist ZM 241385 (PDB entry: 4EIY)



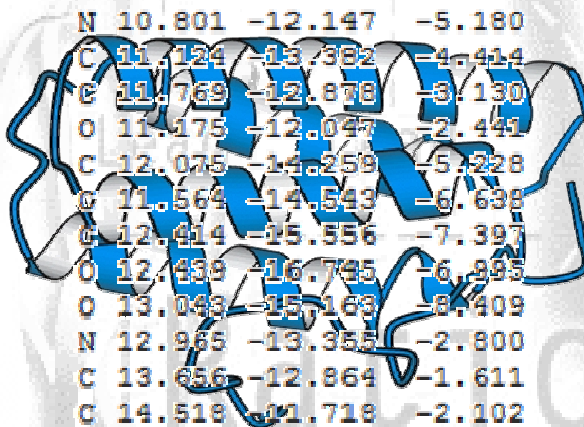
I would like to start from here!



NMR Spectroscopy



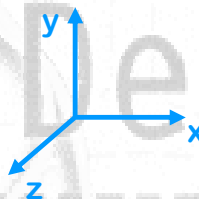
X-Ray Crystallography



Comparative/Homology Modeling



3D





# ... and this is our favorite hunting place!

[www.rcsb.org](http://www.rcsb.org)

The screenshot shows the RCSB PDB website interface. At the top, there is a navigation bar with links: Deposit, Search, Visualize, Analyze, Download, Learn, and More. A 'MyPDB Login' button is on the right. Below the navigation bar is the main header with the RCSB PDB logo and the text 'An Information Portal to 107436 Biological Macromolecular Structures'. A search bar is present with the placeholder text 'Search by PDB ID, author, macromolecule, sequence, or ligands' and a 'Go' button. Below the search bar are links for 'Advanced Search' and 'Browse by Annotations'. A row of logos for partner databases (PDB-101, Worldwide PDB, EMDataBank, Nucleic Acid Database, Structural Biology Knowledgebase) is displayed. Social media icons for Facebook, Twitter, YouTube, and Apple are on the right.

**Welcome**

- Deposit
- Search
- Visualize
- Analyze
- Download
- Learn

### A Structural View of Biology

This resource is powered by the Protein Data Bank archive-information about the 3D shapes of proteins, nucleic acids, and complex assemblies that helps students and researchers understand all aspects of biomedicine and agriculture, from protein synthesis to health and disease.

As a member of the wwPDB, the RCSB PDB curates and annotates PDB data.

The RCSB PDB builds upon the data by creating tools and resources for research and education in molecular biology, structural biology, computational biology, and beyond.

#### Structure and Health Focus: Ebola Virus Proteins

- [Video Tour](#)
- [Molecule of the Month Article](#)

### March Molecule of the Month

Phototropin



# PDB... in numbers:

Other Statistics ▾

## PDB Data Distribution by Experimental Method and Molecular Type

Copy CSV

Experimental Method	Proteins	Nucleic Acids	Protein/NA Complex	Other	Total
X-Ray	117342	1919	6000	10	125271
NMR	10706	1243	249	8	12206
Electron Microscopy	1540	31	539	0	2110
Other	215	4	6	13	238
Multi Method	116	4	2	1	123
Total	129919	3201	6796	32	139948

**115093** structures in the PDB have a structure factor file.

**9545** structures in the PDB have an NMR restraint file.

**3297** structures in the PDB have a chemical shifts file.

**2136** structures in the PDB have a 3DEM map file.

### Sunburst Chart for Experimental Method and Molecular Type

Distribution by experimental method shown in yellow; molecular type in blue. Mouse over to view the statistical description of the particular section; click on a section to zoom in that particular section's statistical distribution, and then click on the center bullseye to zoom out back to the previous distribution.

19 March 2015

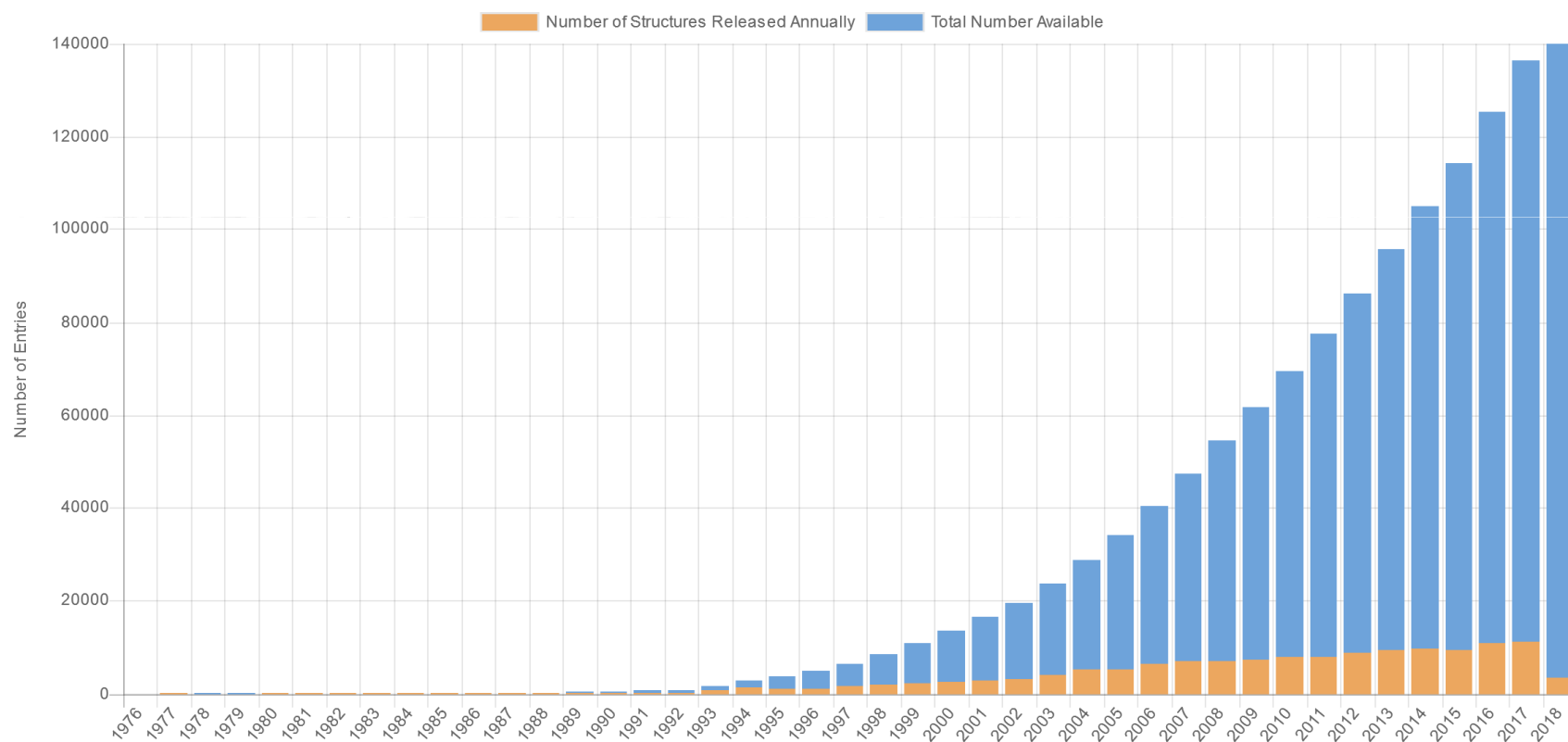




# PDB... in numbers:

PDB Statistics: Overall Growth of Released Structures Per Year

Other Statistics ▾







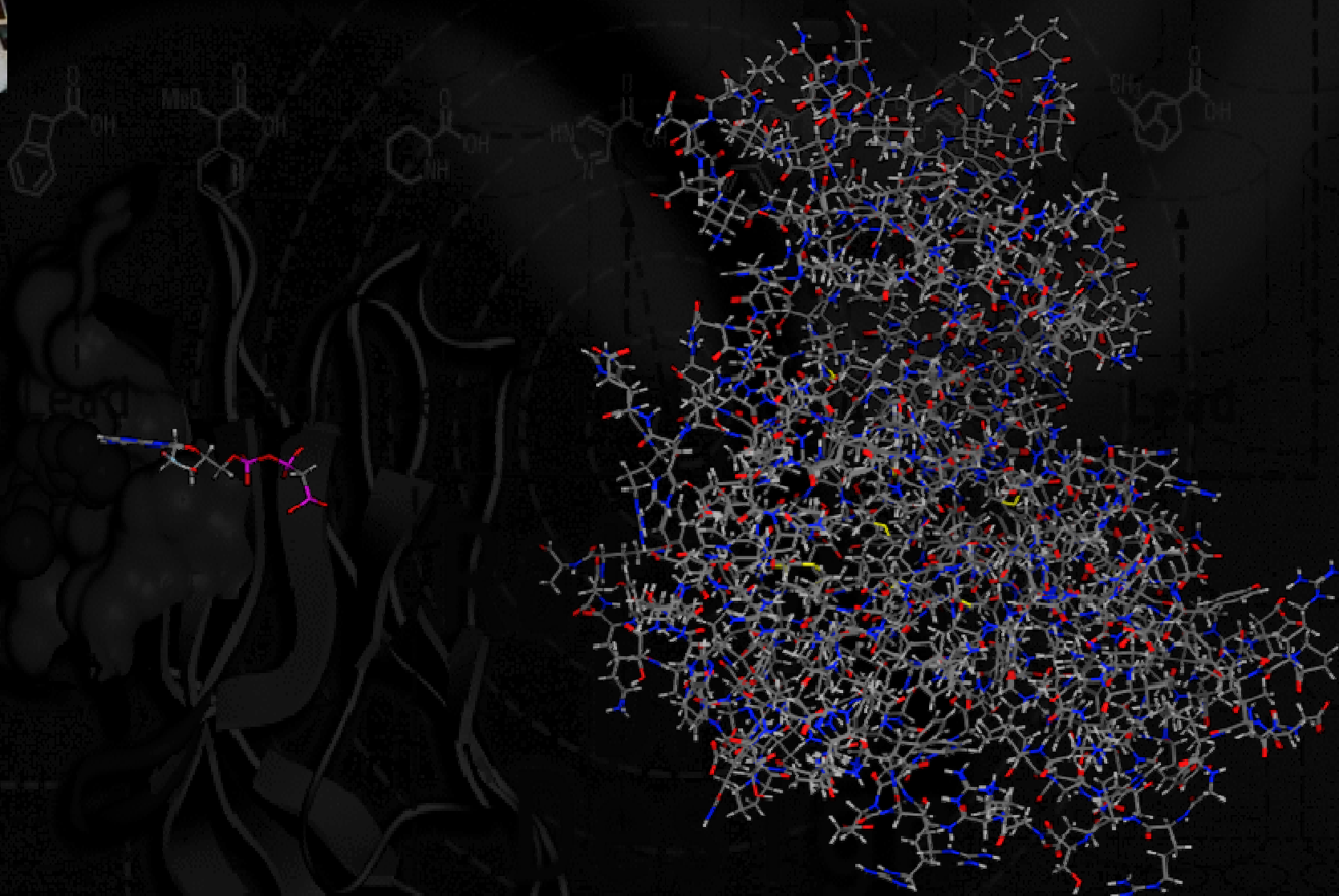
do you remember?

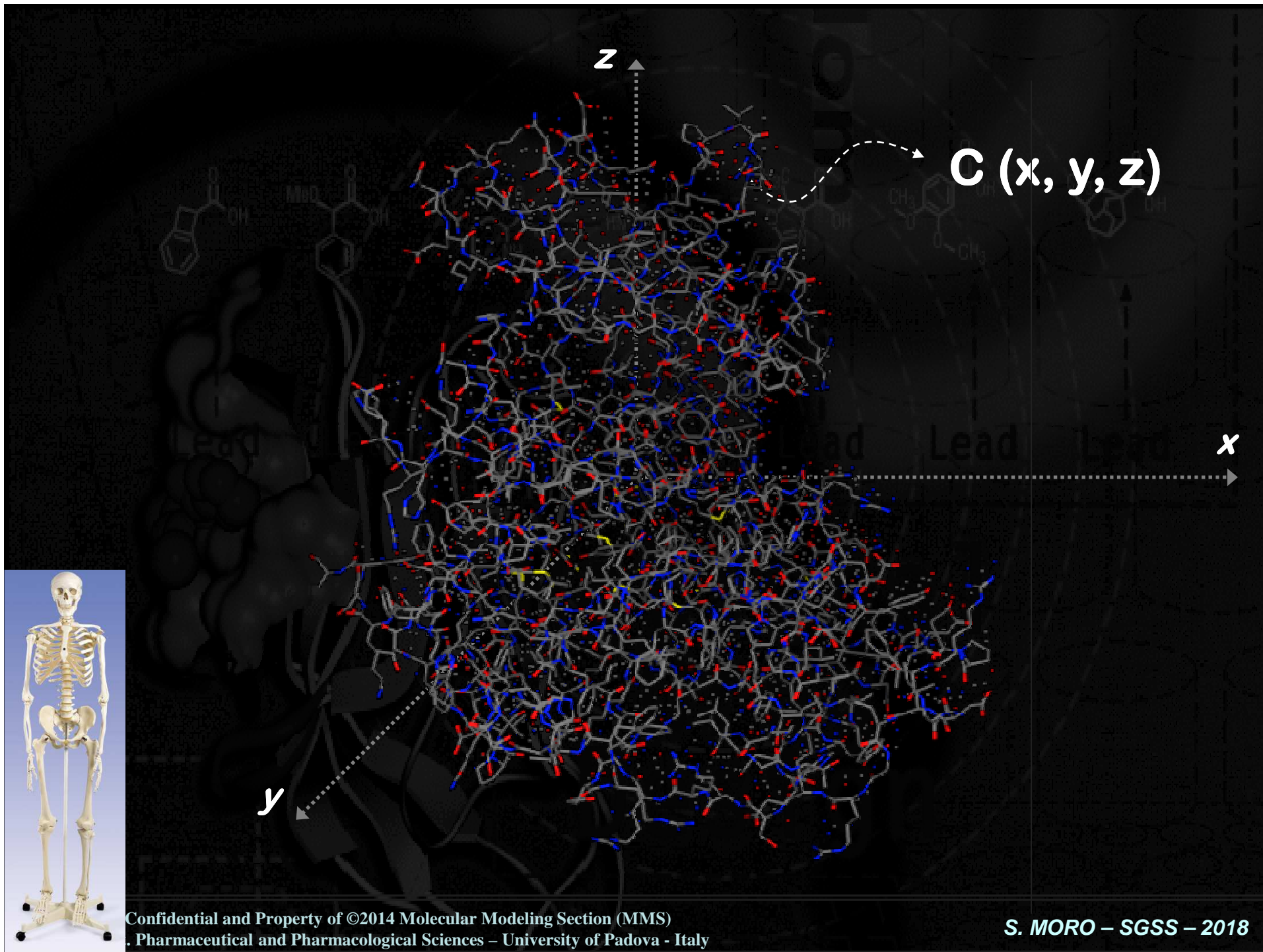
***Experiment Typical Cost per Compound (€)***

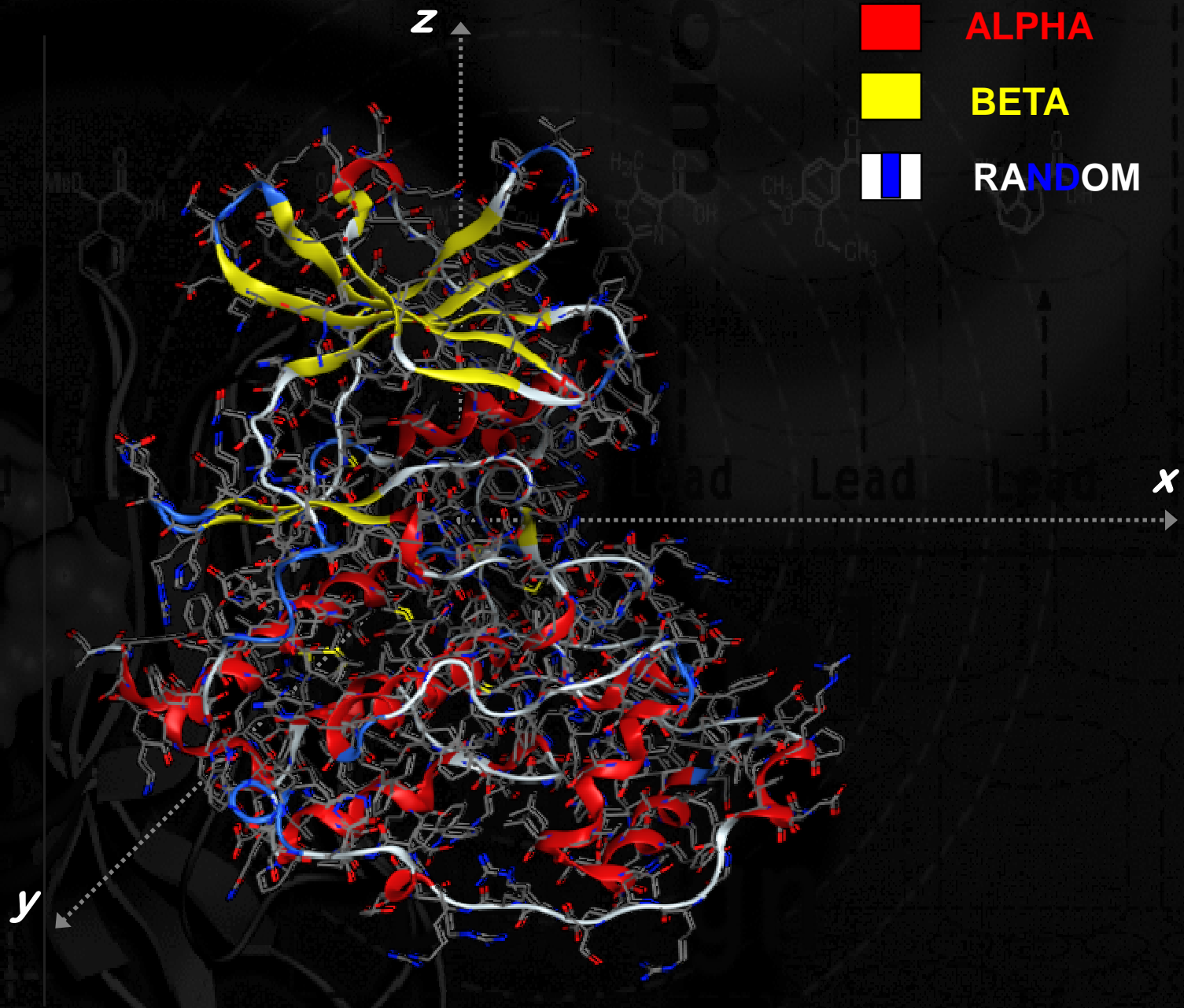
<b>Computer modeling</b>	<b>7</b>
<b>Biochemical assay</b>	<b>270</b>
<b>Cell culture assay</b>	<b>2.700</b>
<b>Rat acute toxicity</b>	<b>8.100</b>
<b>Protein crystal structure</b>	<b>68.000</b>
<b>Animal efficacy trial</b>	<b>200.000</b>
<b>Rat 2-year chronic oral toxicity</b>	<b>550.000</b>
<b>Human clinical trial</b>	<b>3.500.000</b>



# From small molecule to its biological target...







Back when I was young:

“It is generally accepted that receptor and substrate molecules recognize each other at their molecular surfaces. Therefore, the binding strength of a receptor-drug complex depends on the shape of the substrate surface and on the distribution of certain properties on this surface. Any method attempting to model biological activity should take into account this information and try to correlate it to biological activity...”

by Johann Gasteiger *et al* *J.A.C.S.* 1995, 117, 7769-7775



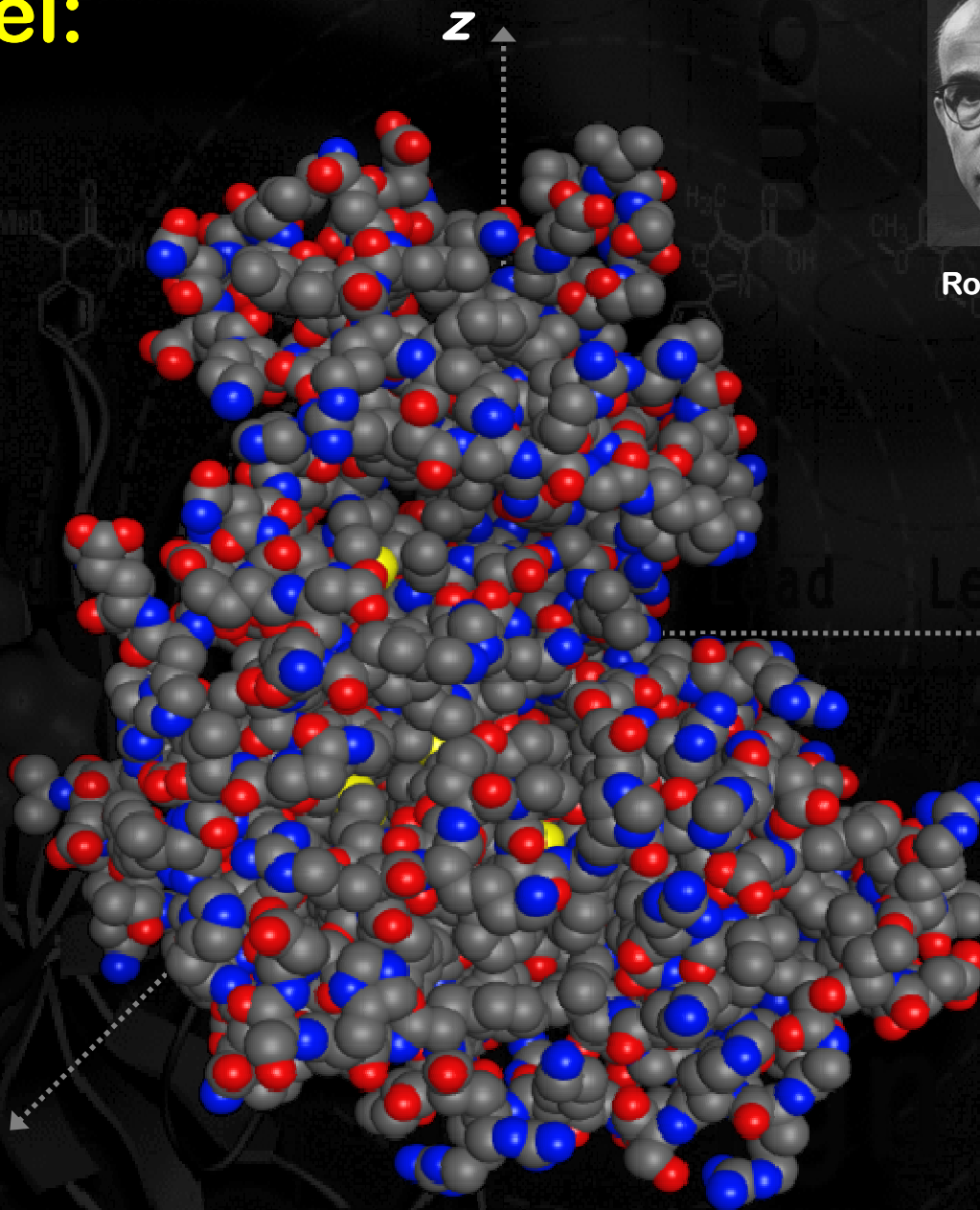
# CPK model:

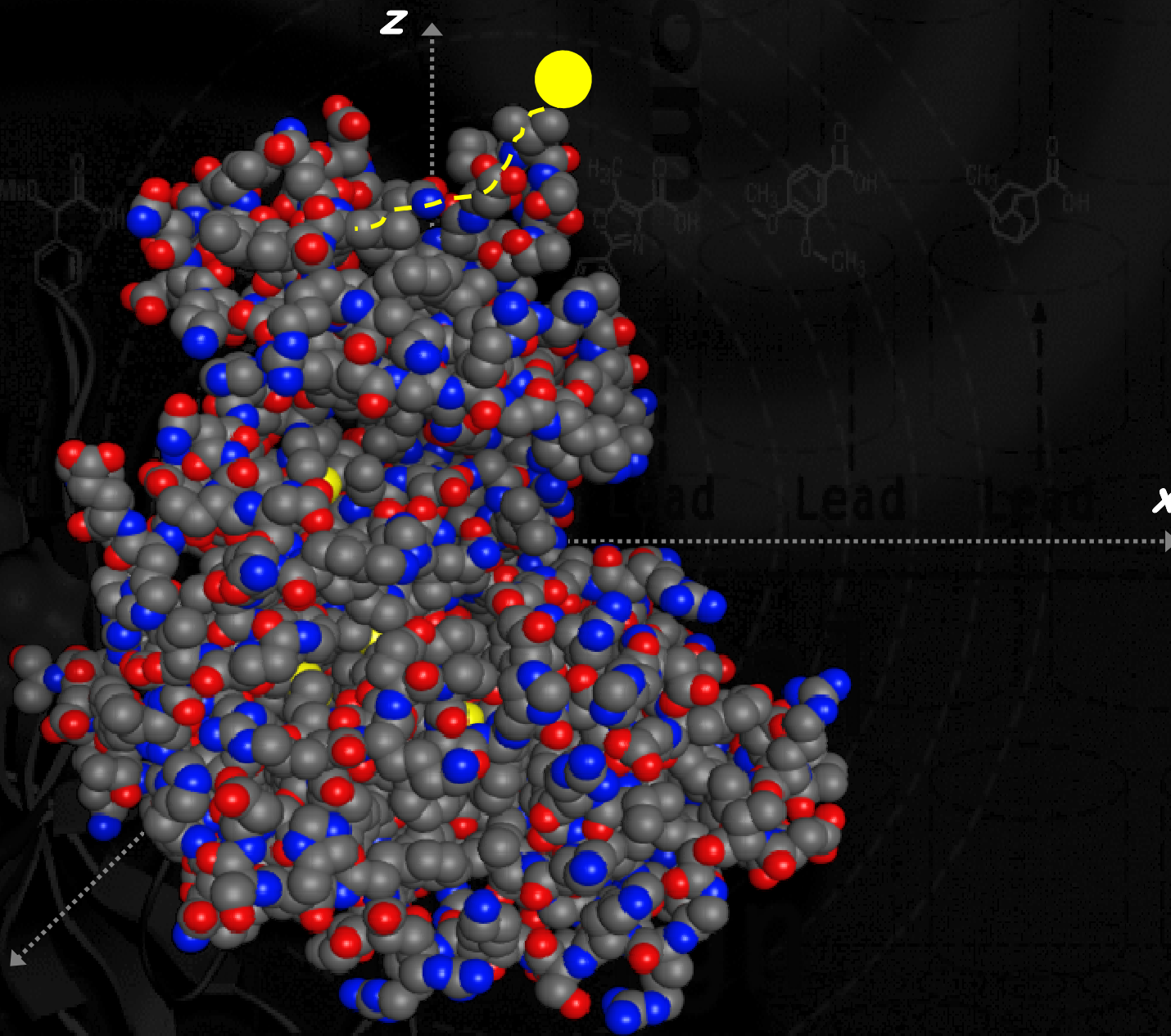


Robert Corey Linus Pauling



Walter Koltun

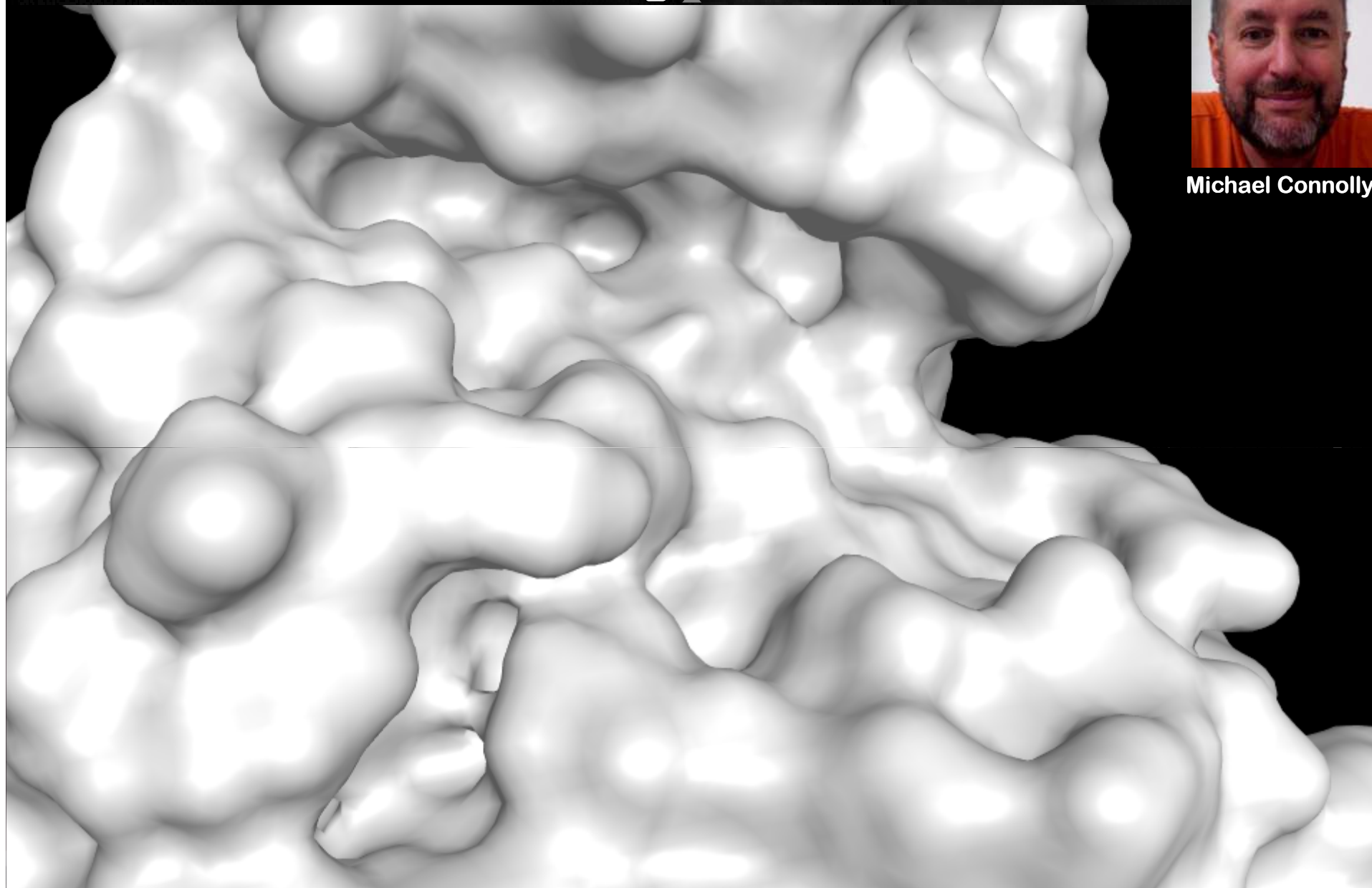




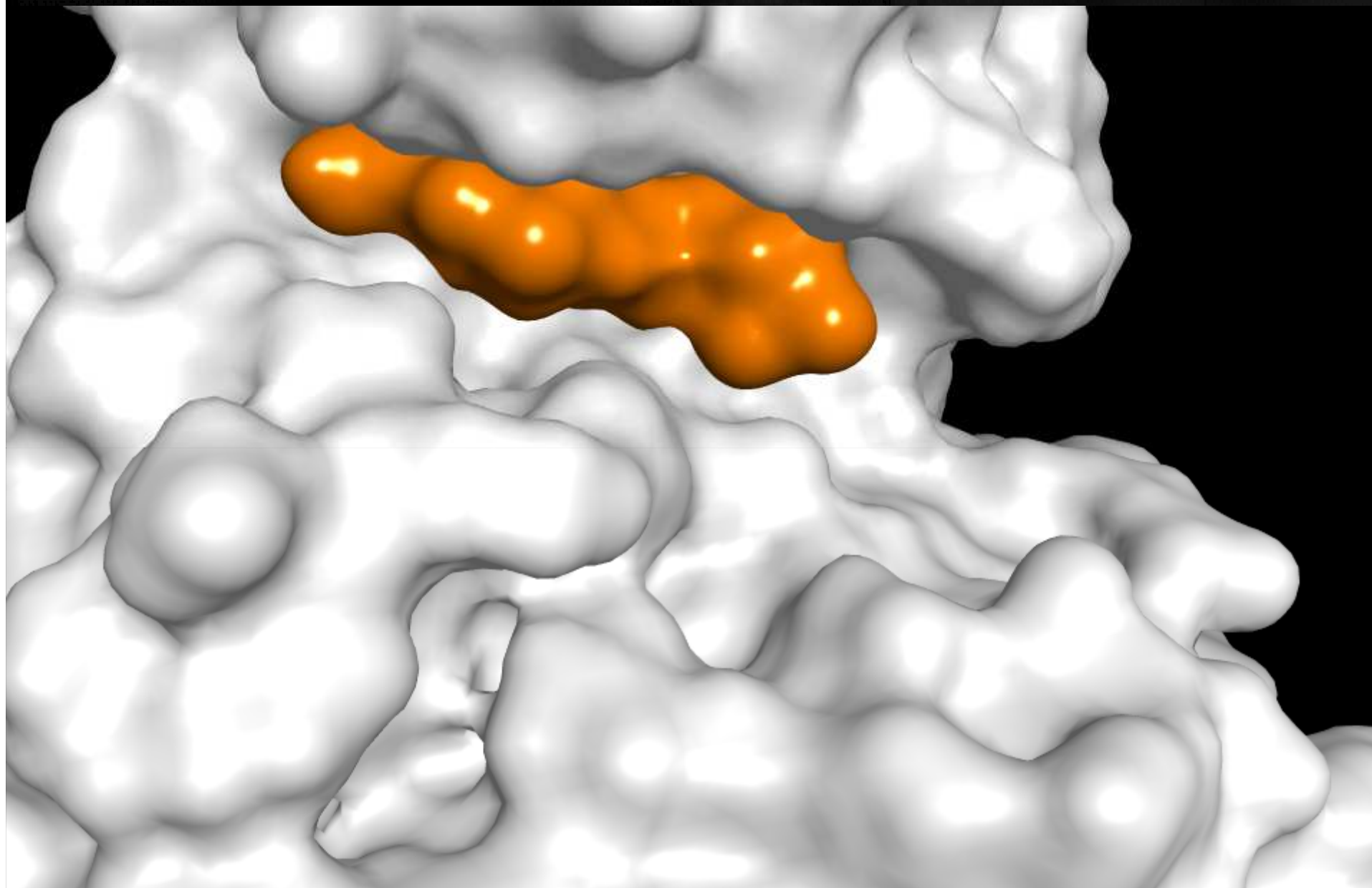
z ▲



Michael Connolly

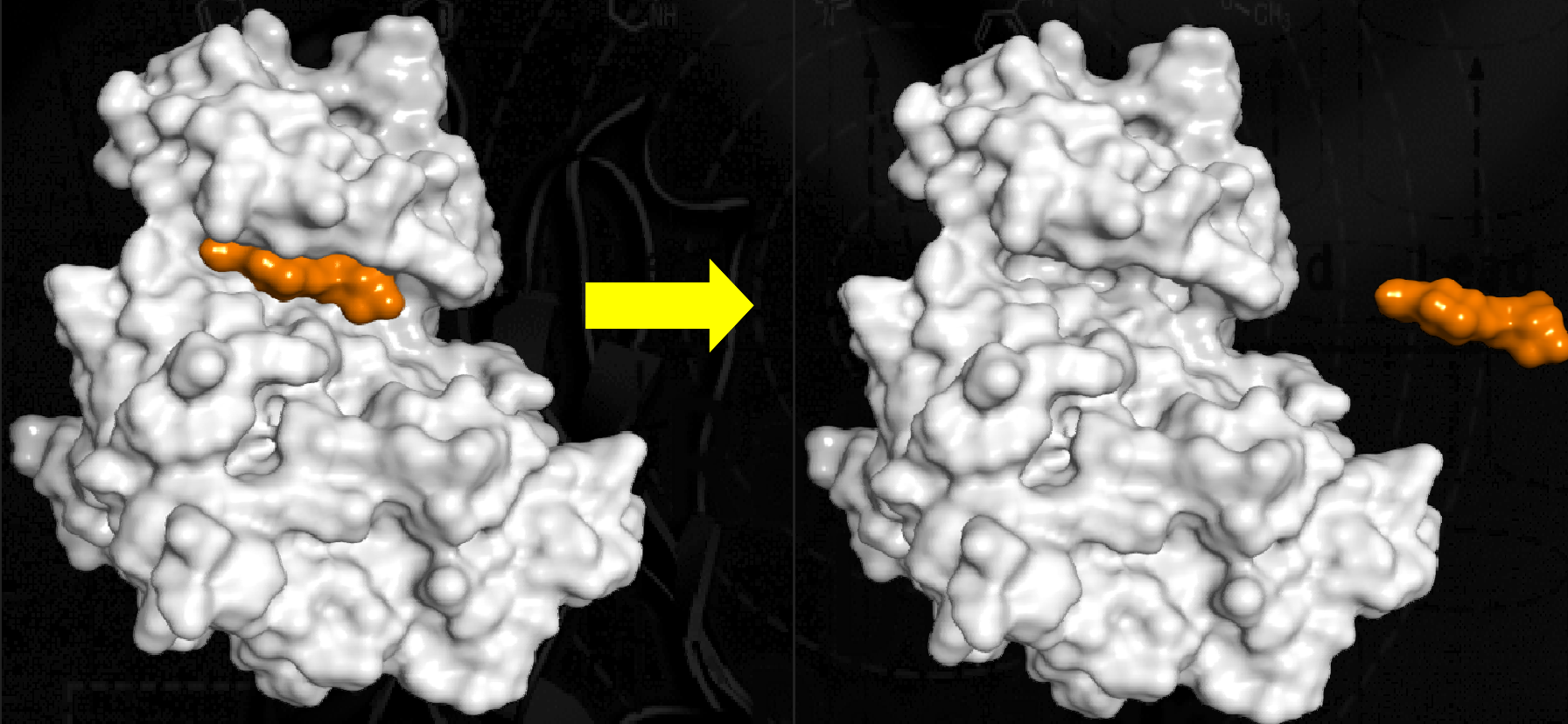








You have now a wonderful tool to estimate the topological complementarity between a cavity and its ligand:



$$\text{Complementarity} \propto \text{Vol}_{\text{cavity}} - \text{Vol}_{\text{ligand}}$$

Back when I was young:

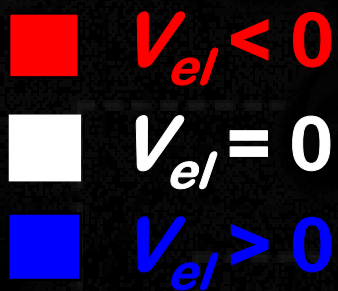
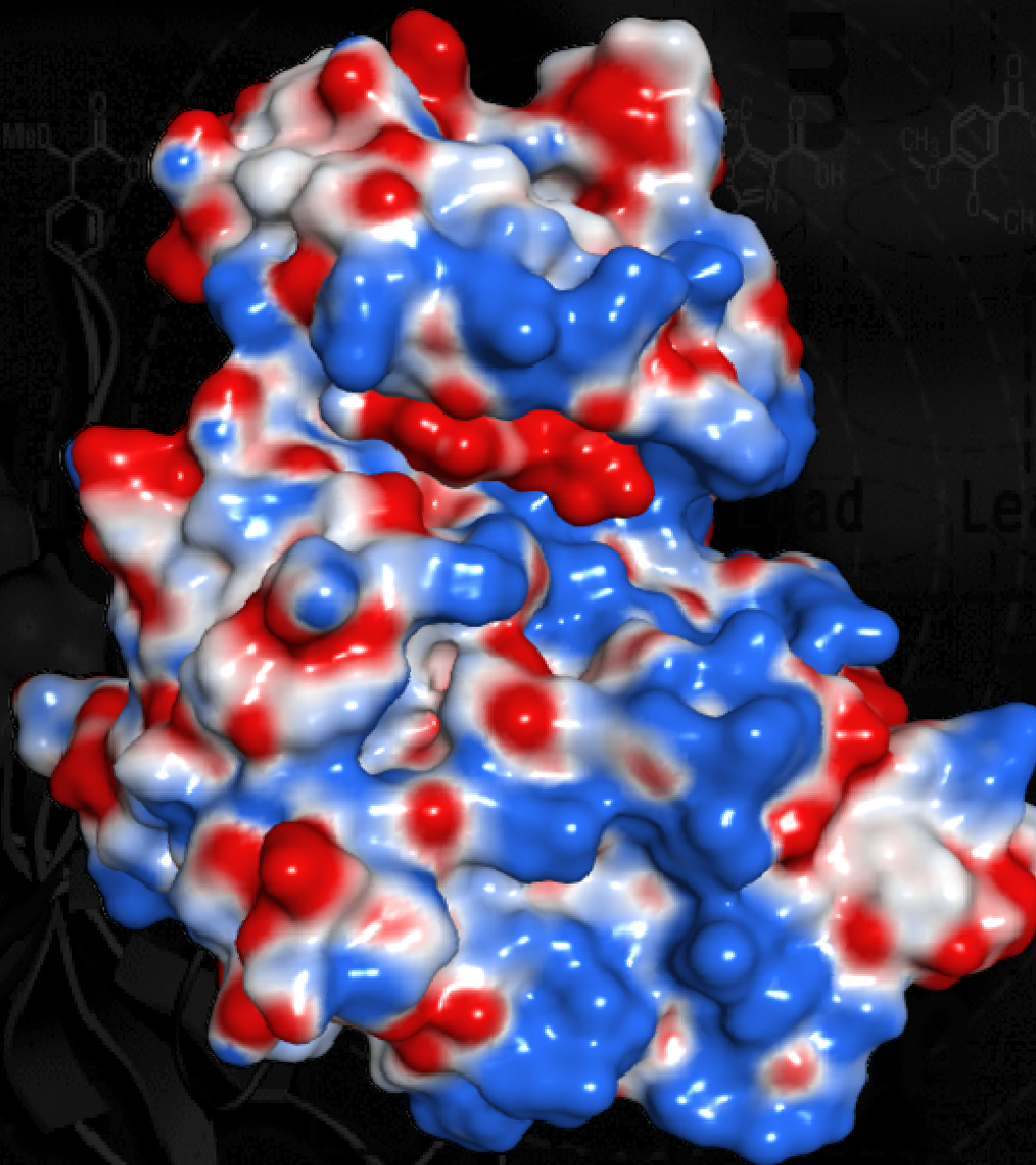
“It is generally accepted that receptor and substrate molecules recognize each other at their molecular surfaces. **Therefore, the binding strength of a receptor-drug complex depends on the shape of the substrate surface and on the distribution of certain properties on this surface.** Any method attempting to model biological activity should take into account this information and try to correlate it to biological activity...”

by Johann Gasteiger *et al J.A.C.S.* 1995, 117, 7769-7775

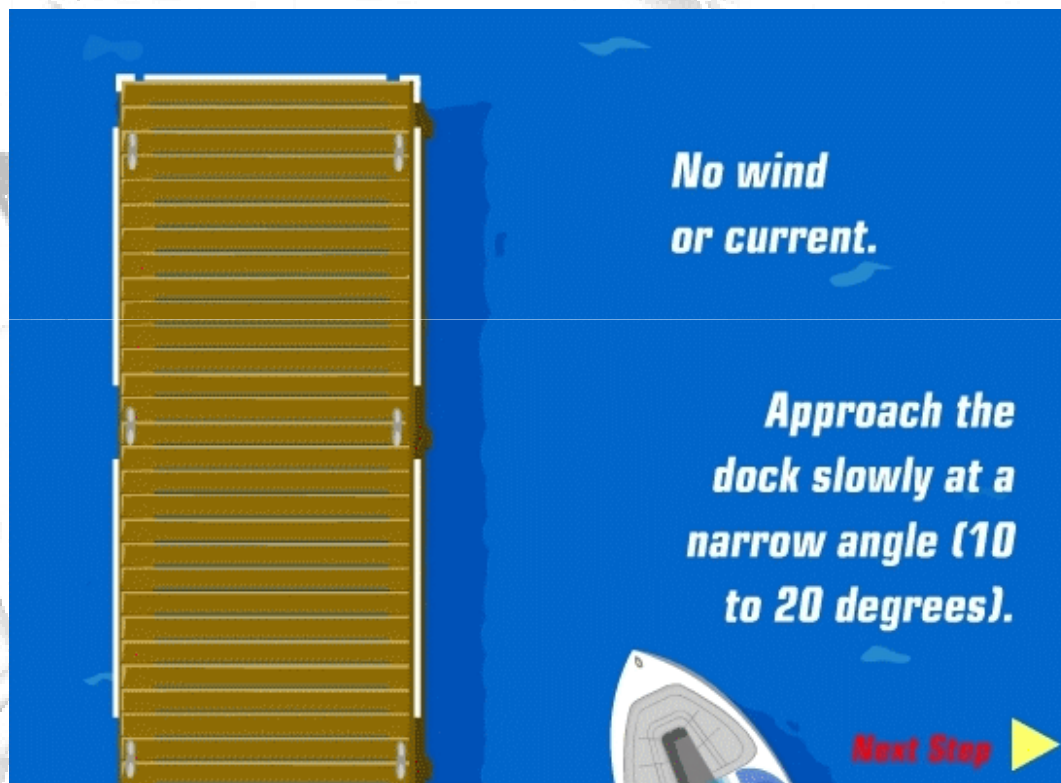




... very charming!



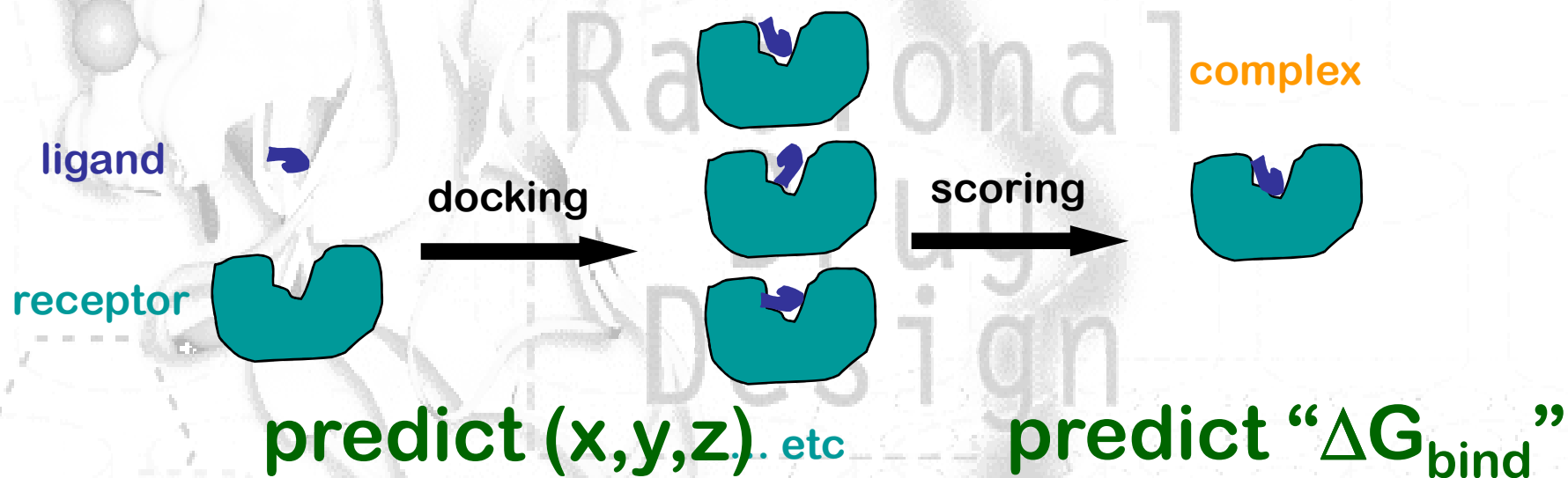
# Docking and Scoring



# The molecular docking problem:

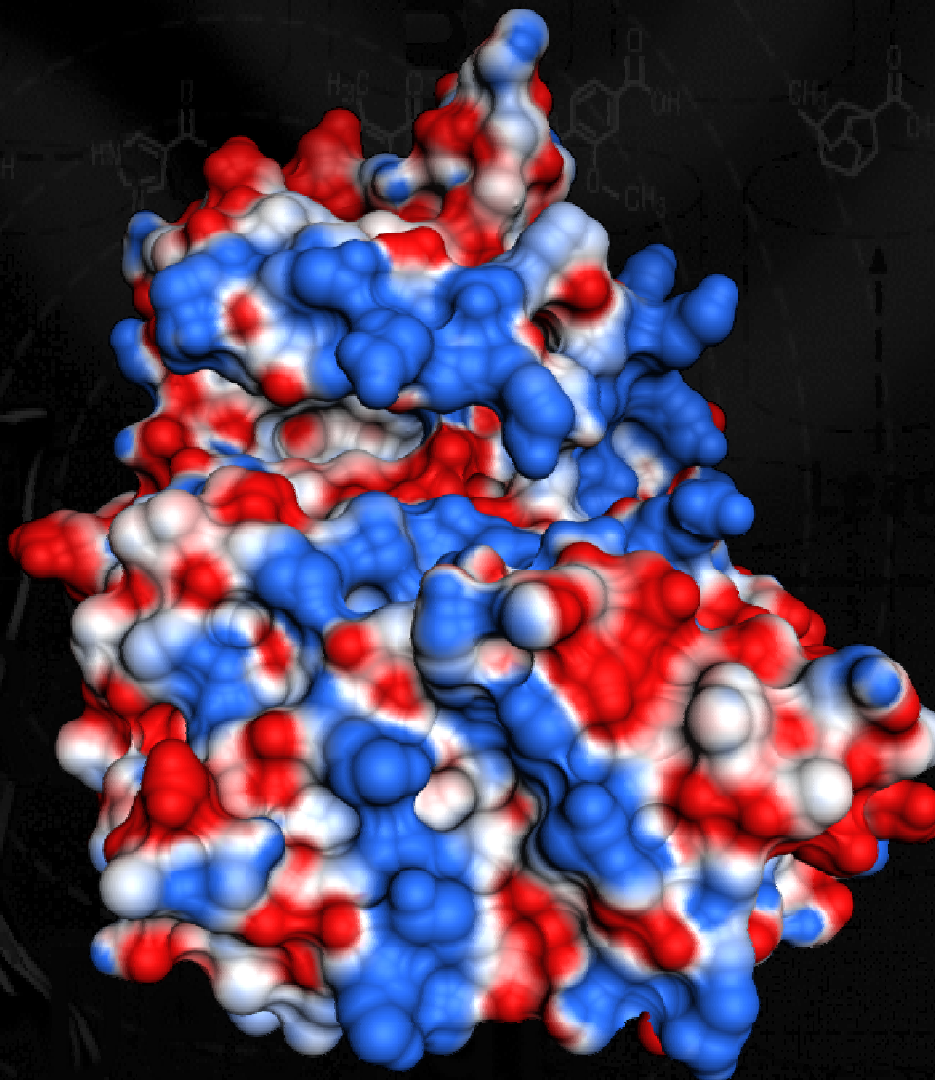
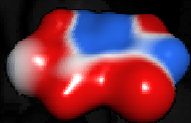
To place a ligand (small molecule) into the binding site of a receptor in the manners appropriate for optimal interactions with a receptor (DOCKING).

To evaluate the ligand-receptor interactions in a way that may discriminate the experimentally observed mode from others and estimate the binding affinity (SCORING).





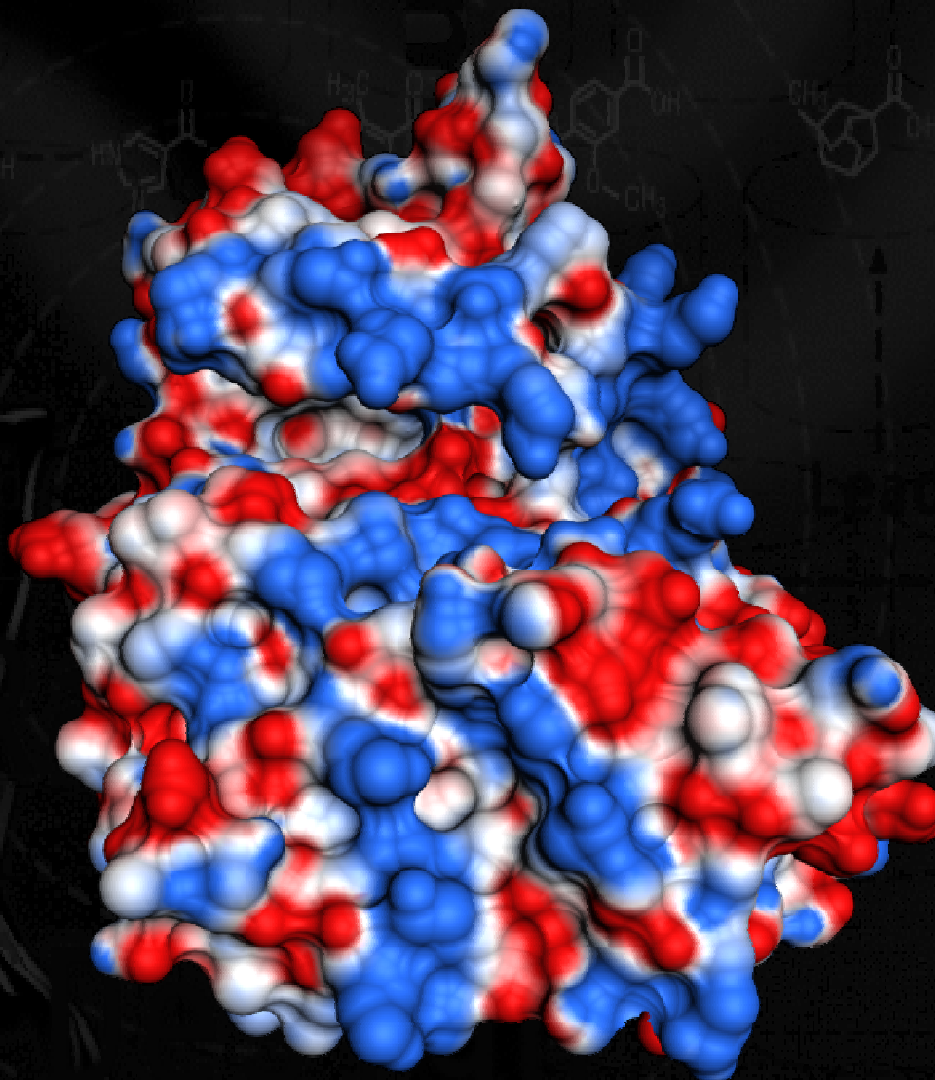
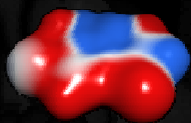
# Here is the problem...



1. where?
2. how?
3. how long?



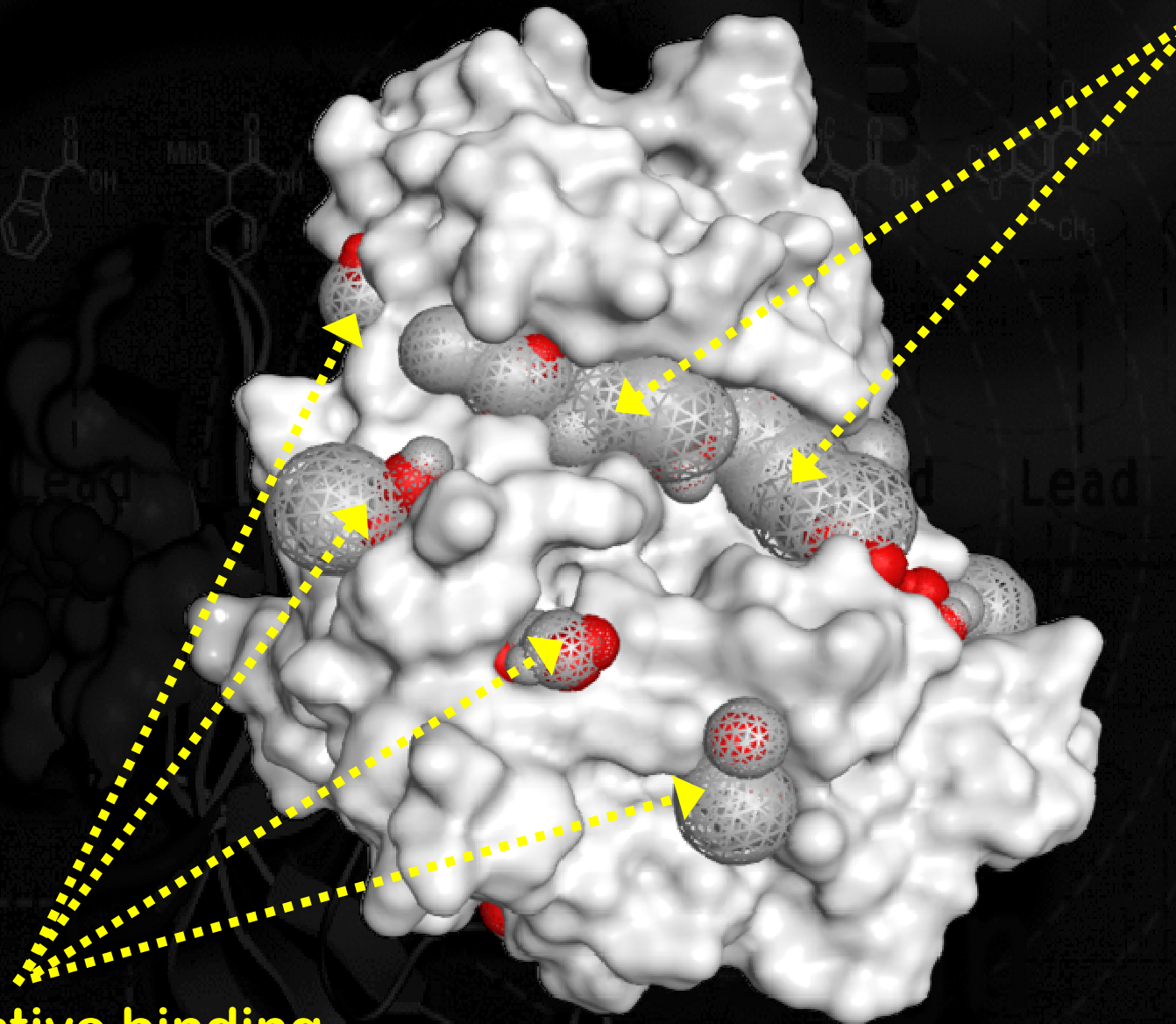
# Virtualize docking and scoring...



1. where?



Principal binding site



Alternative binding

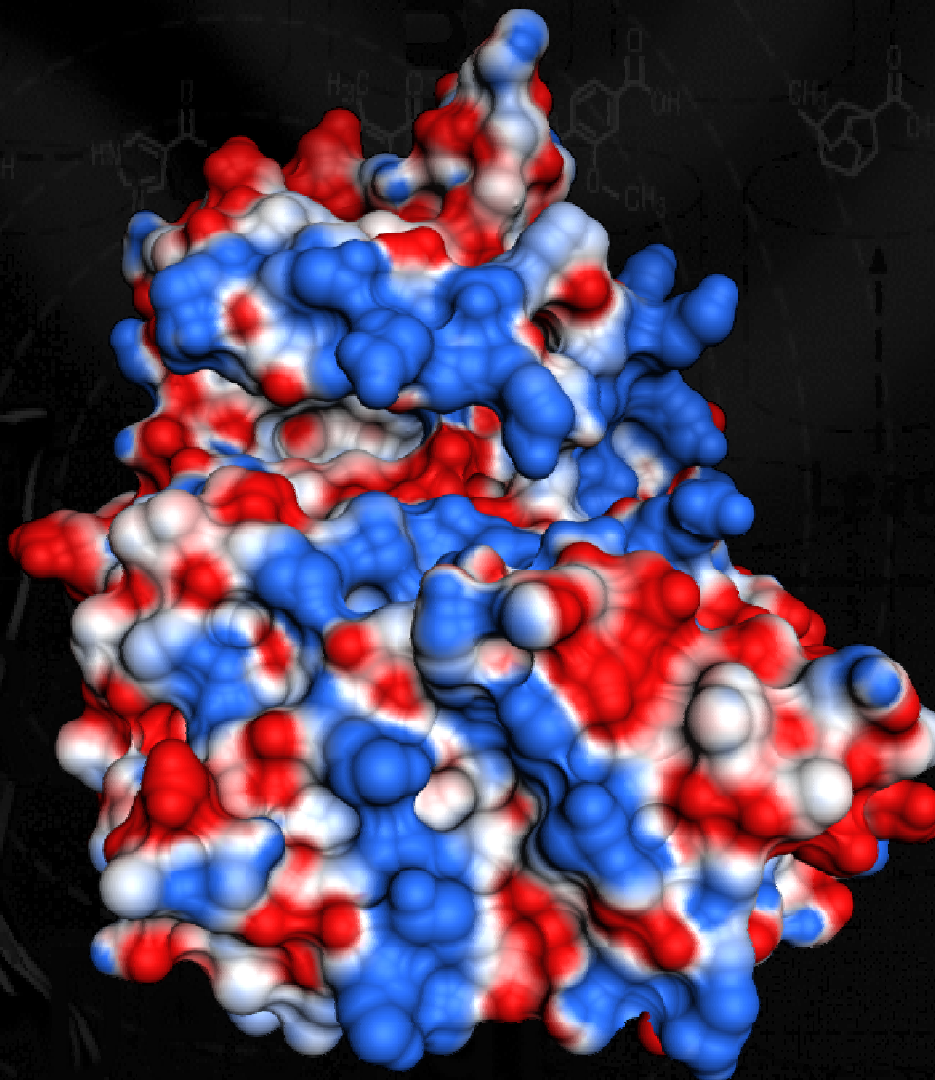
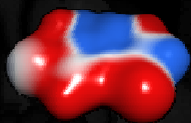
MS  
MS

Confidential and Property of ©2014 Molecular Modeling Section (MMS)  
Dept. Pharmaceutical and Pharmacological Sciences – University of Padova - Italy

S. MORO – SGSS – 2018

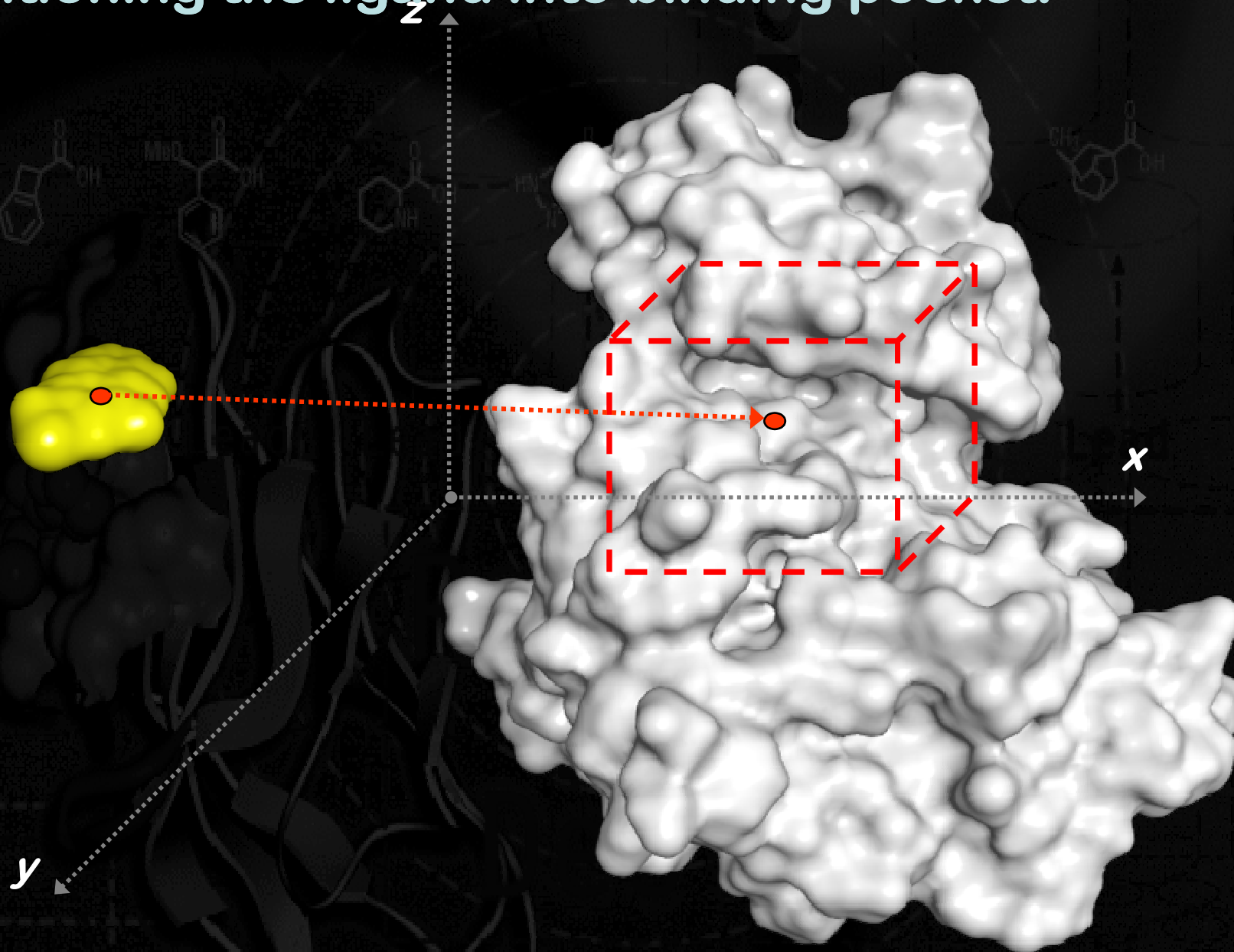


# Virtualize docking and scoring...

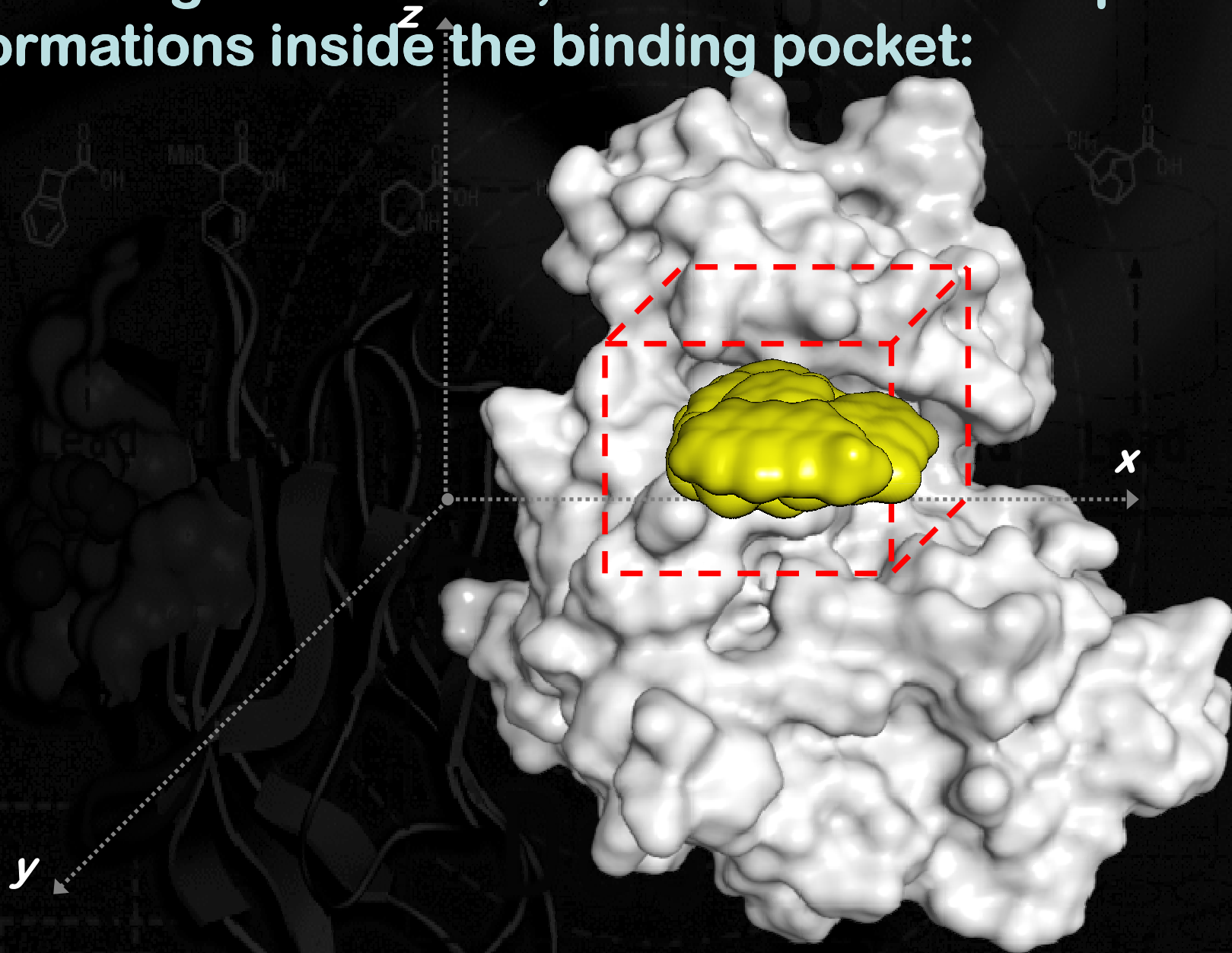


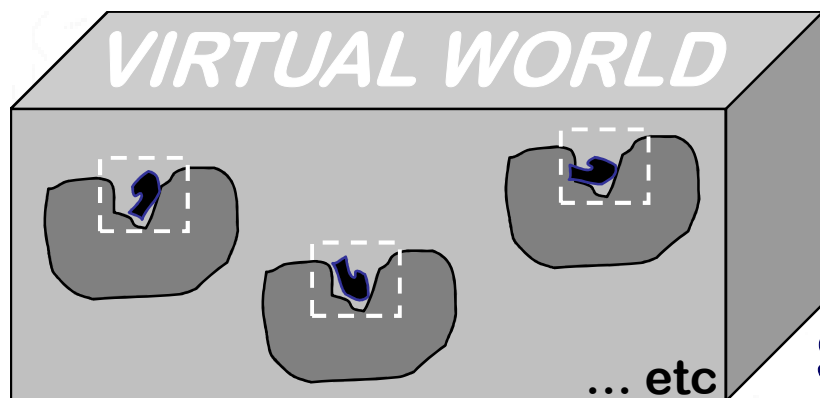
1. where?
2. how?

# 1. Positioning the ligand into binding pocket:



## 2. Docking: translate, rotate and exploring conformations inside the binding pocket:





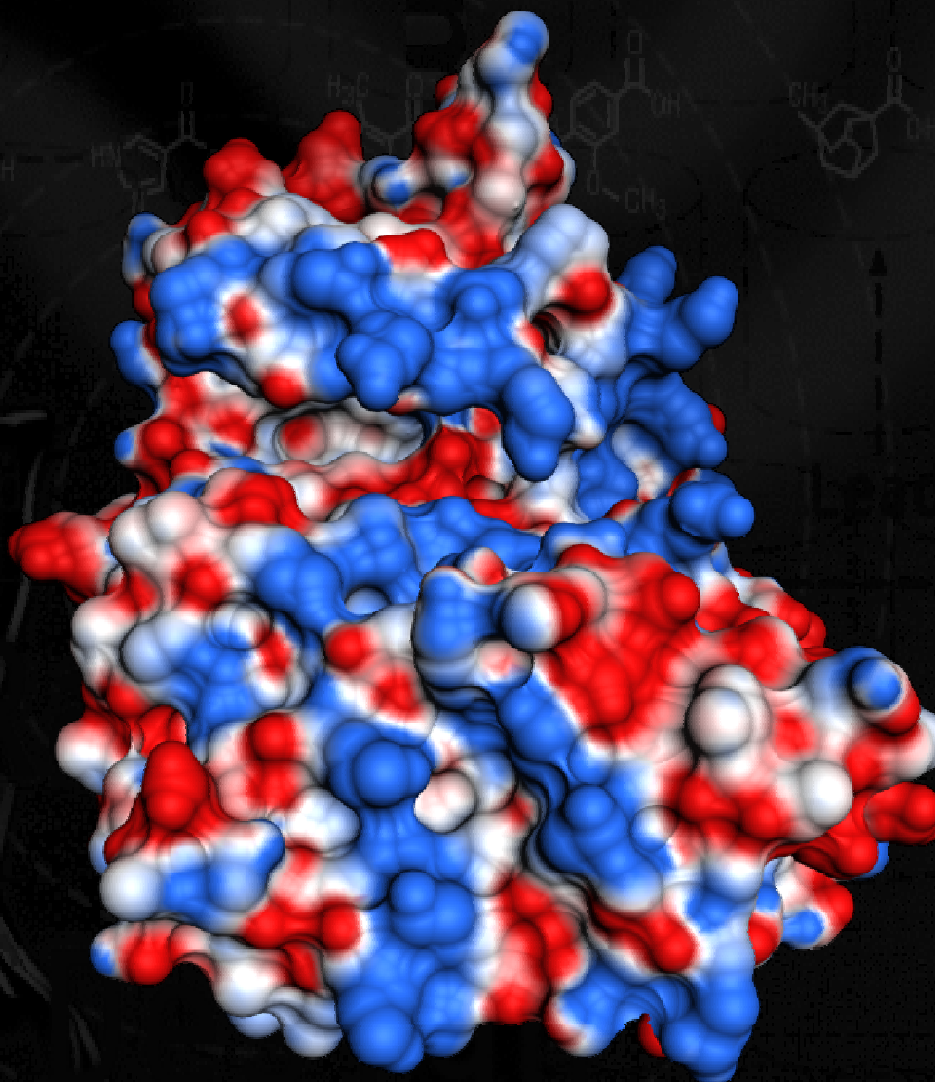
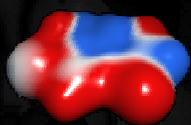
**Some definitions:**

**We define as POSE:**

- a. the respective orientation of the ligand vs protein;**
- b. the bound conformation of the ligand.**



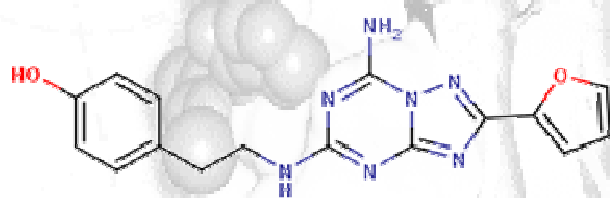
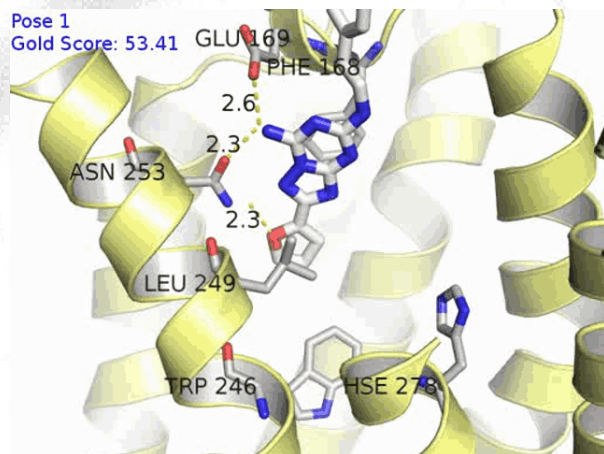
# Virtualize docking and scoring...



1. where?
2. how?
3. how long?

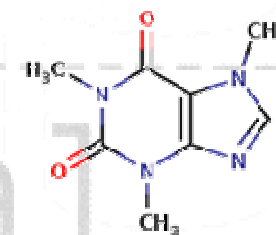
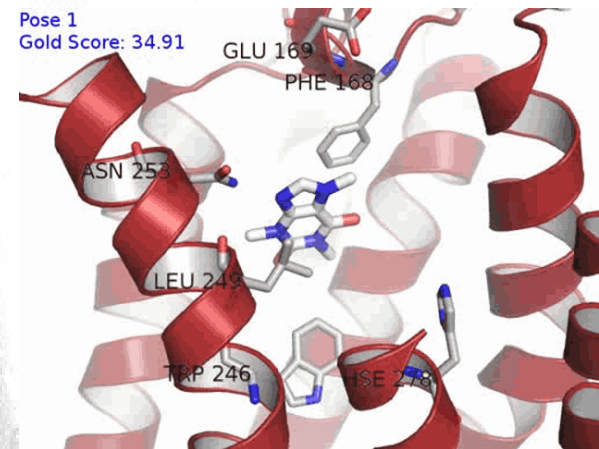
# Il ruolo dell'intelligenza umana e artificiale nella scoperta di nuovi farmaci

**Docking performance: can we preliminary analyze the stability of the complex poses?**



ZM 241385

**strong binder**

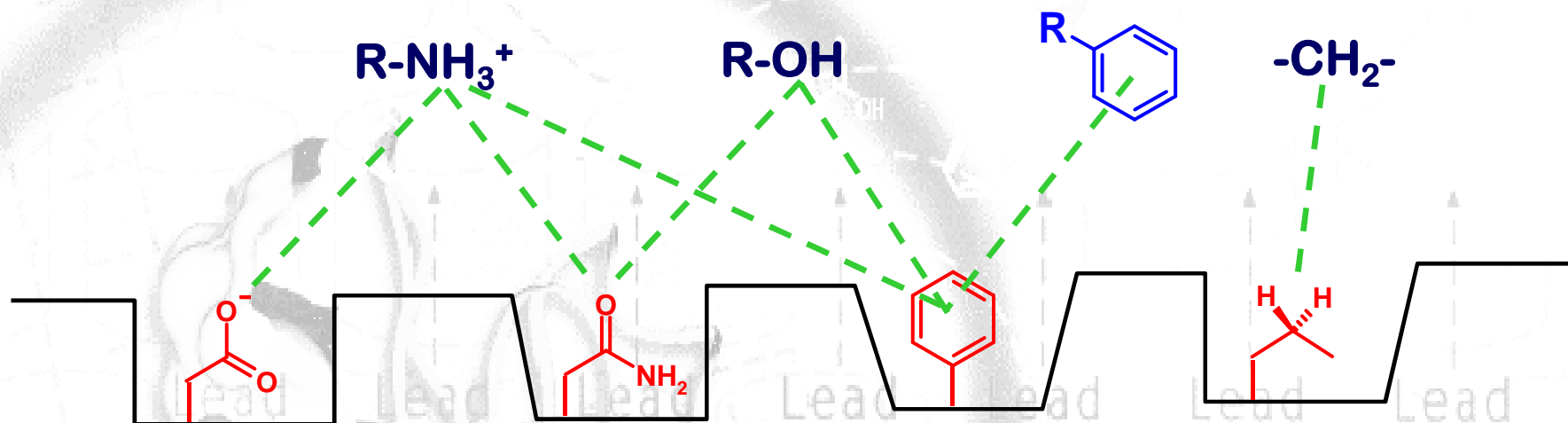


Caffeine

**weak binder**

**... from a chemical point of view, how could we distinguish between strong and weak binders?**

# Empirical Scoring Functions



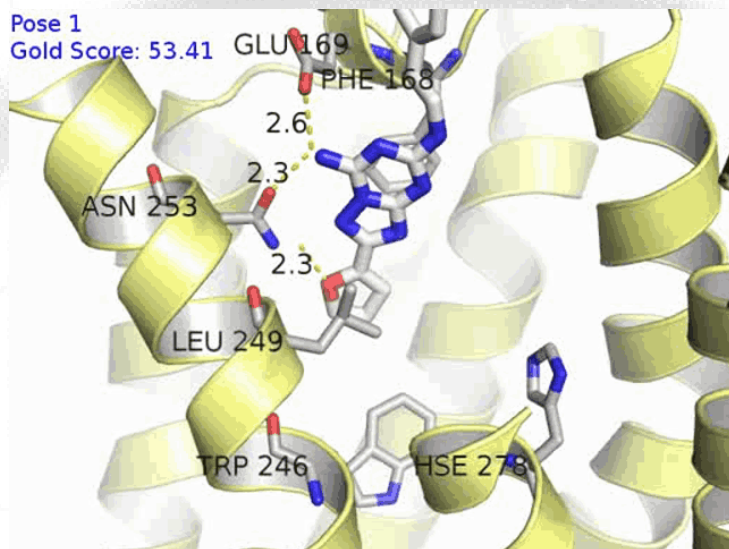
charge-charge interaction (*ionic bond*):  
 charge-dipole interaction:  
 charge- $\pi$  interaction:  
 hydrogen bond:  
 charge transfer interaction:  
 $\pi$ - $\pi$  interaction:  
 dipole-dipole interaction (*van der Waals*):

(*kcal/mol*)

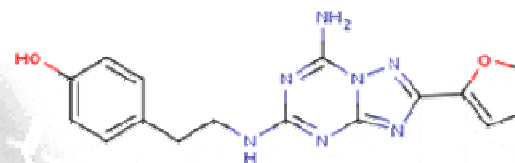
$-\Delta G^0 \cong$	5 ÷ 10
$-\Delta G^0 \cong$	1 ÷ 7
$-\Delta G^0 \cong$	8 ÷ 10
$-\Delta G^0 \cong$	1 ÷ 7
$-\Delta G^0 \cong$	1 ÷ 6
$-\Delta G^0 \cong$	1 ÷ 2
$-\Delta G^0 \cong$	0.5 ÷ 1



# Here is a real example:

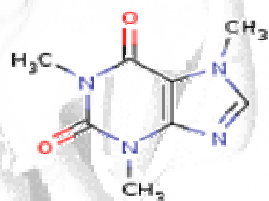


ZM

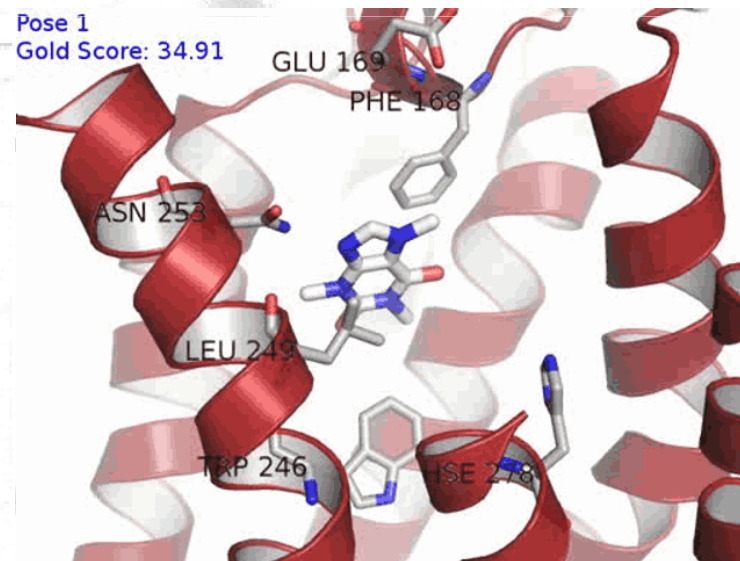


$K_i = 1.6 \text{ nM (h\_A}_{2A})$

Lead Lead Lead Lead

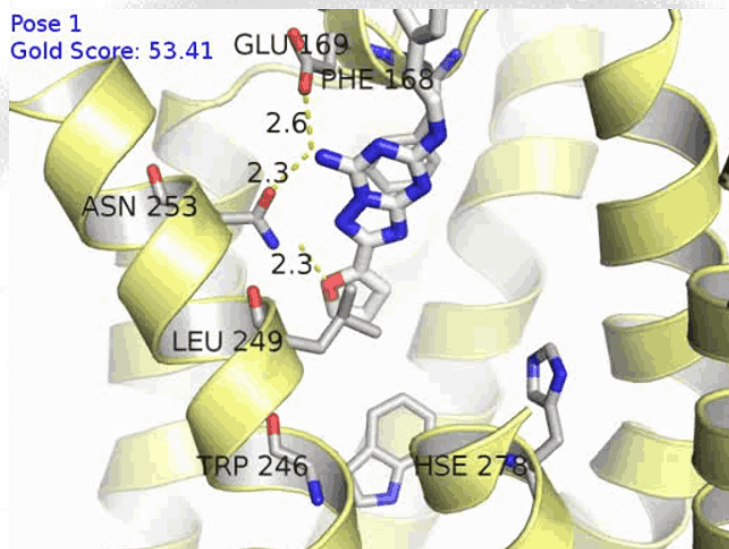


$K_i = 23400 \text{ nM (h\_A}_{2A})$

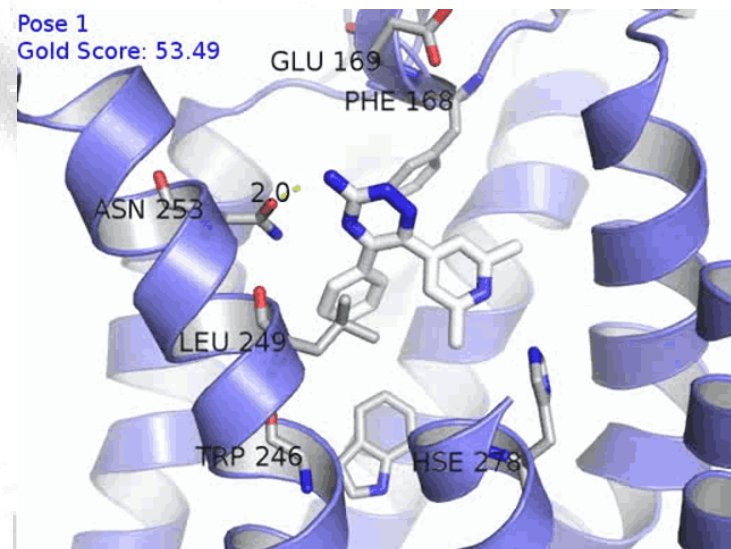


Caffeine

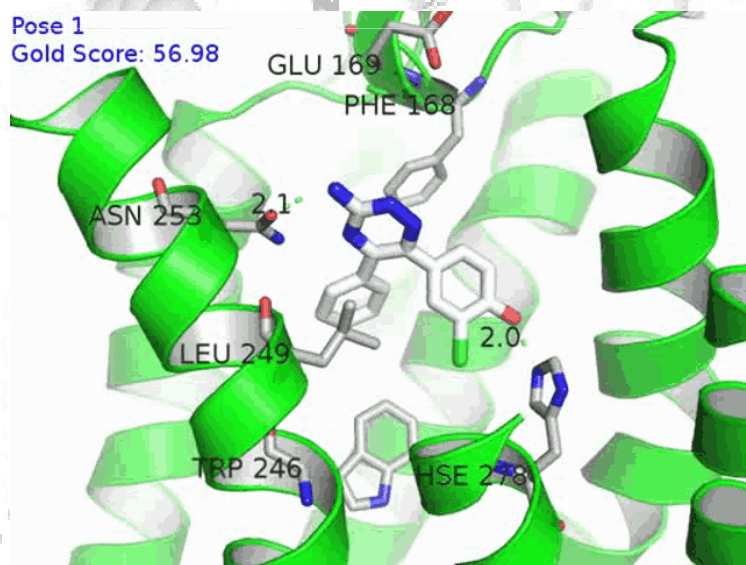
# Here is a real example:



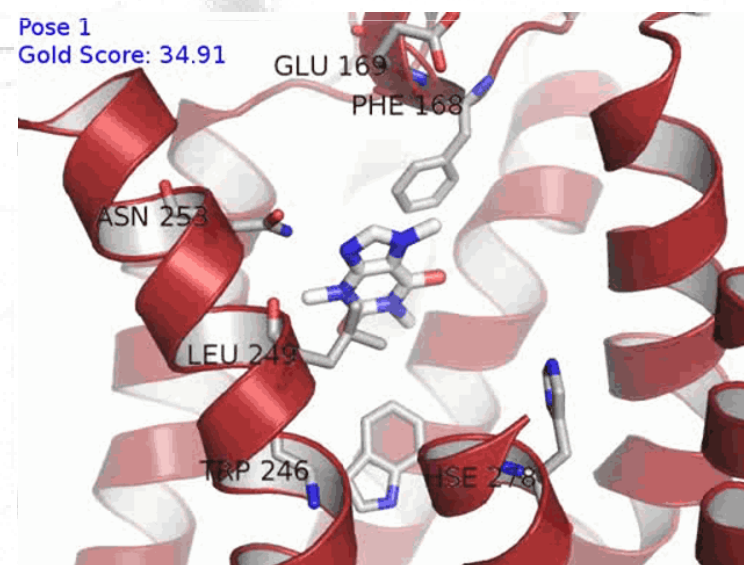
ZM



T4G



T4E



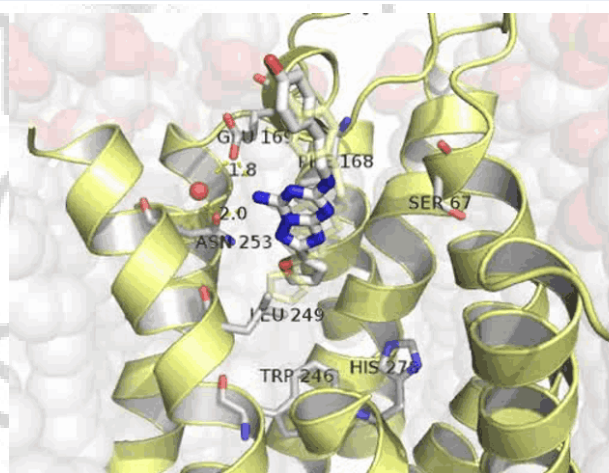
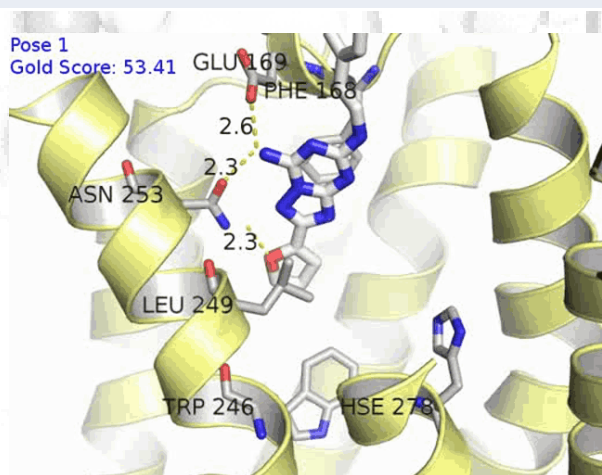
Caffeine

# Il ruolo dell'intelligenza umana e artificiale nella scoperta di nuovi farmaci

## SWAT Analysis

Molecular Docking	
Fast and scalable pose sampling	👍
Rigid protein	😞
Difficult solvent treatment	😞
Serious scoring problems	😞

Molecular Dynamics	
Computational expensive	😞
Investigate receptor full flexibility	👍
Explicit solvent treatment	👍
Accurate binding energy inspection (?)	😞



Ciancetta A.; Moro S. TIPS 36, 878-890, (2015)



# Stretching time!





**GRAZIE**  
**PER LA PAZIENZA**

*Stefano Moro*