

How do researchers design tomorrow's drugs?

Examples: pain and cancer

www.drug-design-workshop.ch

Marie-Claude.Blatter@sib.swiss

Antoine.Daina@sib.swiss

Vincent.Zoete@sib.swiss

FNSNF

FONDS NATIONAL SUISSE
DE LA RECHERCHE SCIENTIFIQUE



Swiss Institute of
Bioinformatics

All the material is available online

<http://education.expasy.org/cours/Outreach/Chimiscope/>

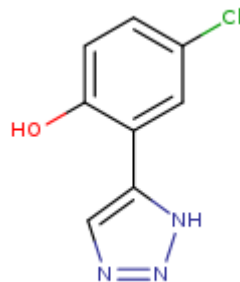
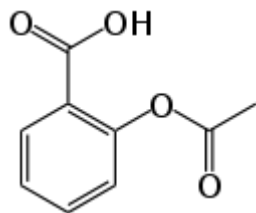
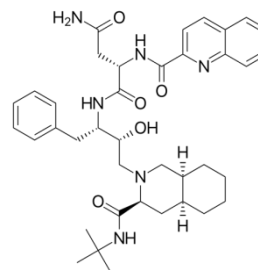
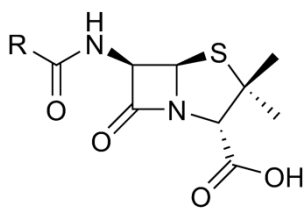
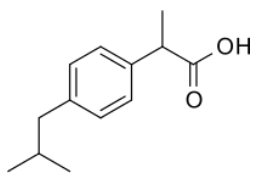


- ✓ **What is a drug?**
- ✓ **How does it work?**
- ✓ **How to select the best drug candidates with the help of bioinformatics?**
- ✓ **Why do a genetic test before a treatment?**



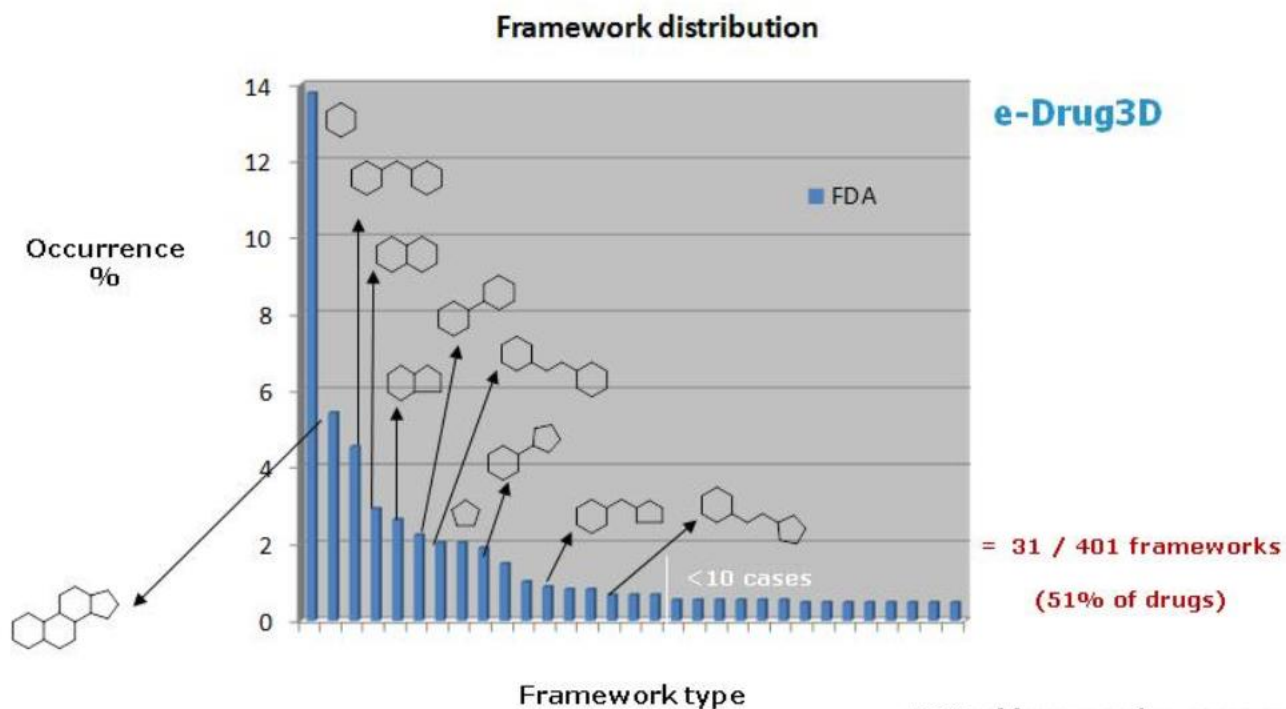
A drug is a small organic molecule (100 atoms)

- ✓ 10^{60} molecules (theory)
- ✓ 35 million molecules
- ✓ 2,000 'drugs'

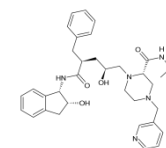


Aspirin (500 mg):
 1.65×10^{21} molecules

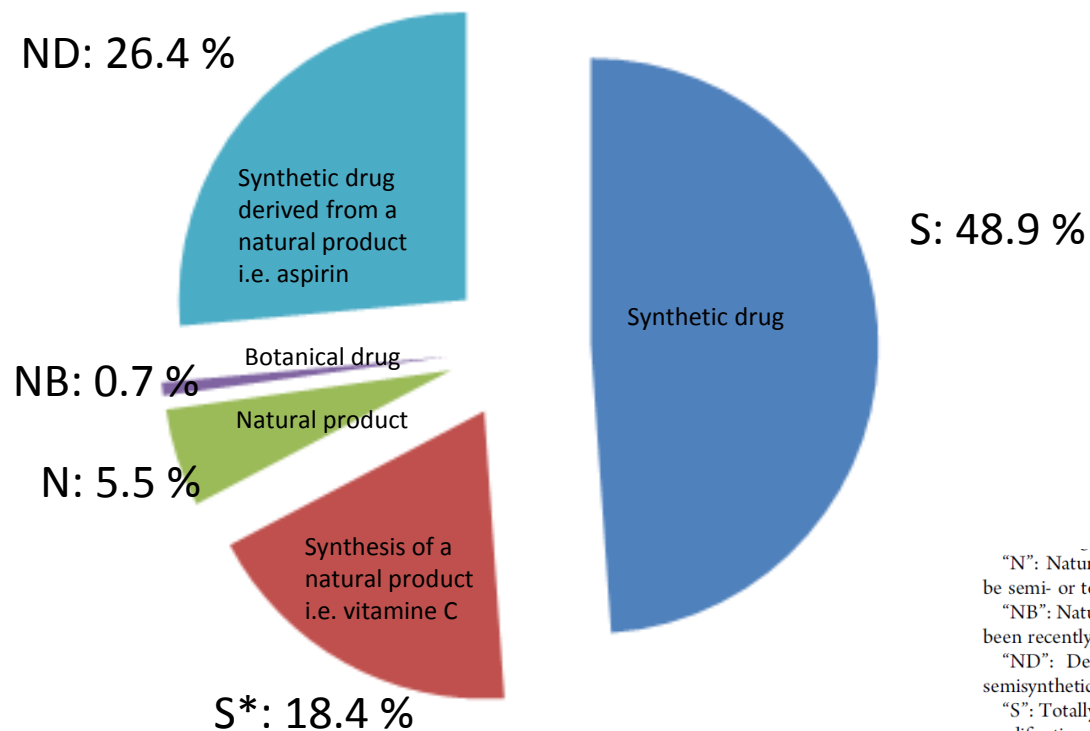
- 51% of drugs are represented by only 31 “frameworks”



59% of frameworks are represented by 1 drug (eg: Indinavir)



Where do the drug molecules come from ?



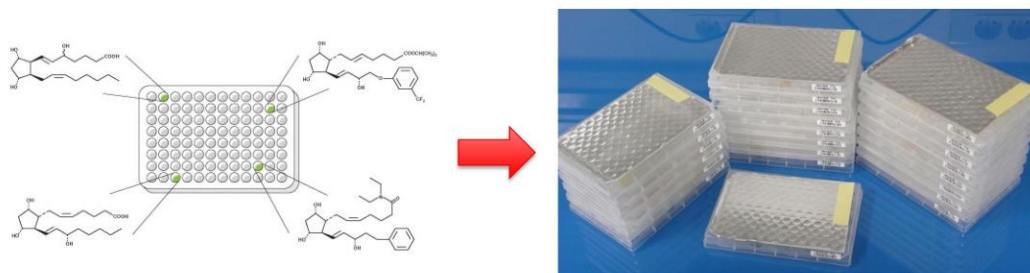
“N”: Natural product, unmodified in structure, though might be semi- or totally synthetic
 “NB”: Natural product “botanical drug” (in general these have been recently approved)
 “ND”: Derived from a natural product and is usually a semisynthetic modification
 “S”: Totally synthetic drug, often found by random screening/ modification of an existing agent
 “S*”: Made by total synthesis, but the pharmacophore is/was from a natural product

categorie	%	number
S	48.88	592
ND	26.43	320
S*	18.41	223
N	5.53	67
NB	0.74	9

<http://pubs.acs.org/doi/pdf/10.1021/acs.jnatprod.5b01055> (2016)

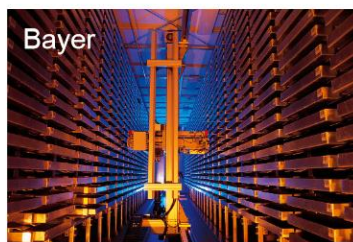
Molecular screening – experimental HTS

Format of the experimental collections:

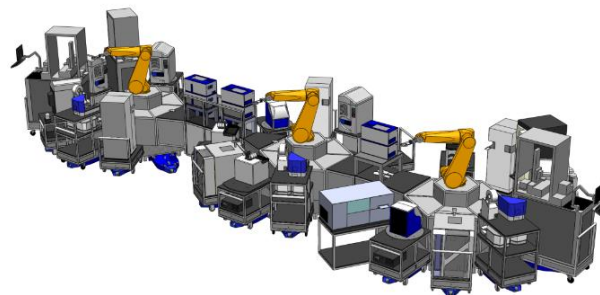


University collection...

... pharmaceutical company collection.



The industrial version :



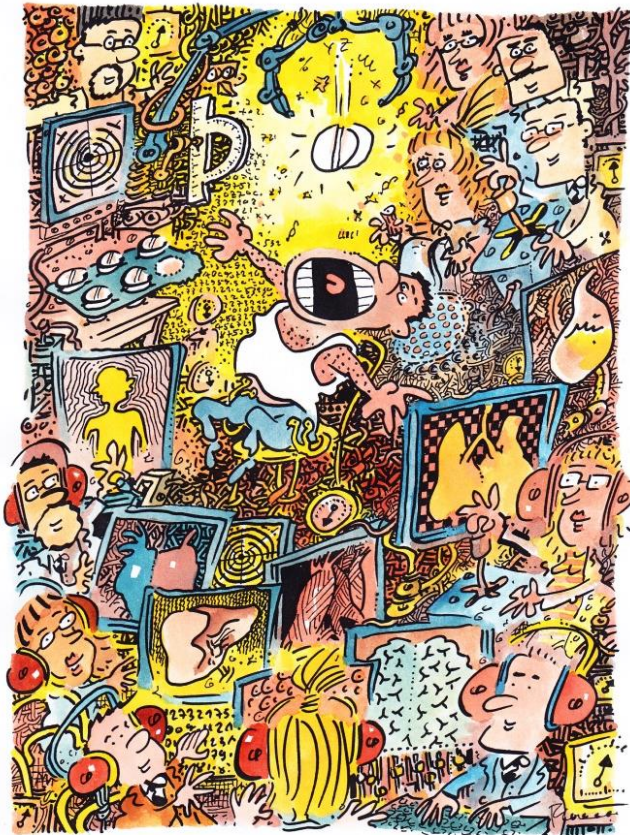
- ✓ 10^{60} molecules (theory)
- ✓ 35 million molecules
- ✓ 2,000 'drugs'

Typical capacity: more than **100,000 compounds per day** in high-density 1536-well formats.

Molecular screening: an alternative

With the help of computers - **Computer-Aided Drug Design (CADD)** - it is possible to select molecules:

- ✓ with the highest affinity for their target
- ✓ which are as specific as possible for their target
- ✓ which have the potential of becoming a drug (i.e. to be taken orally, for the patient's comfort and compliance)



... evaluate **the fate** of the molecule in the body:
absorption, distribution, metabolism and
excretion

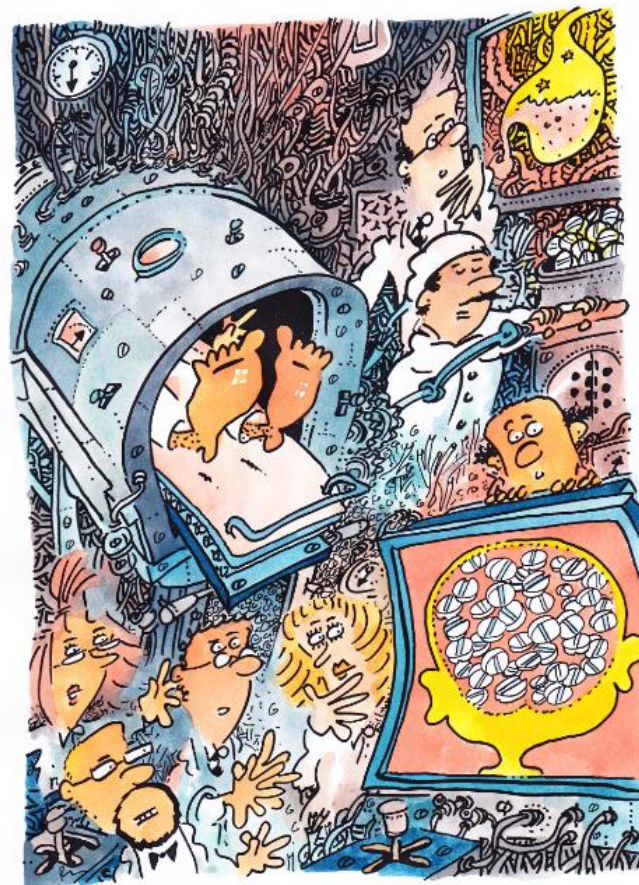


... evaluate the **solubility** of the molecule

Computer-Aided Drug Design (CADD)



... evaluate the **toxicity** of the molecule



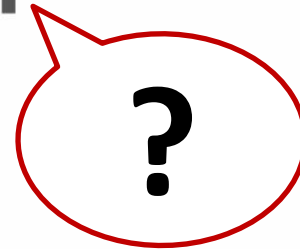
... can the molecule **reach the brain?**

Computer-Aided Drug Design (CADD)

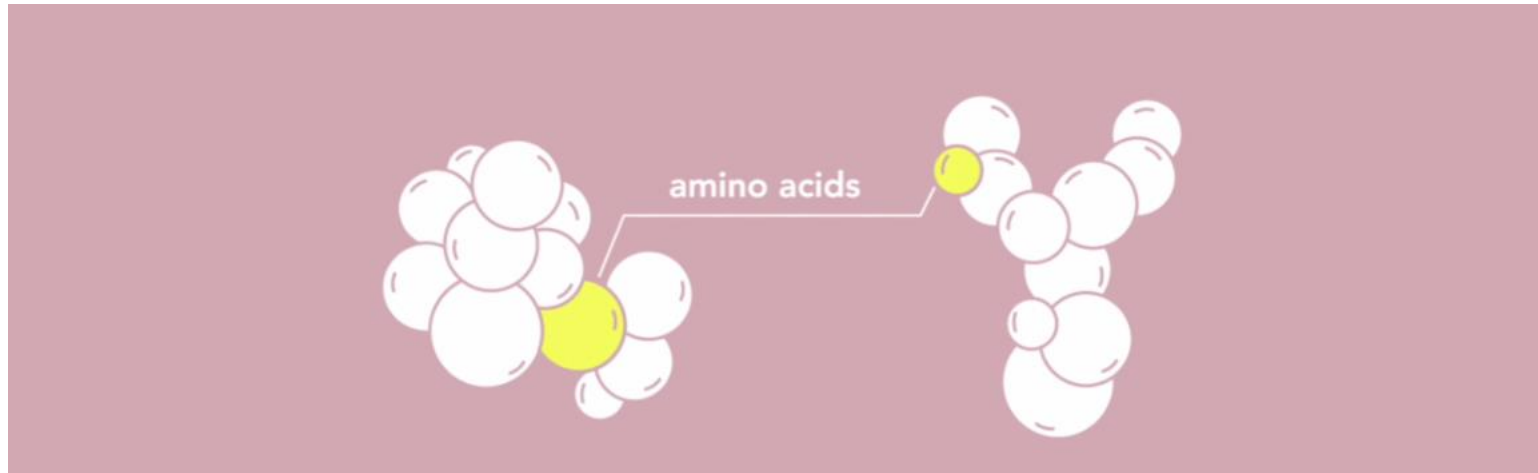
© Pecub, 2016



most of the time,
a drug targets
a protein



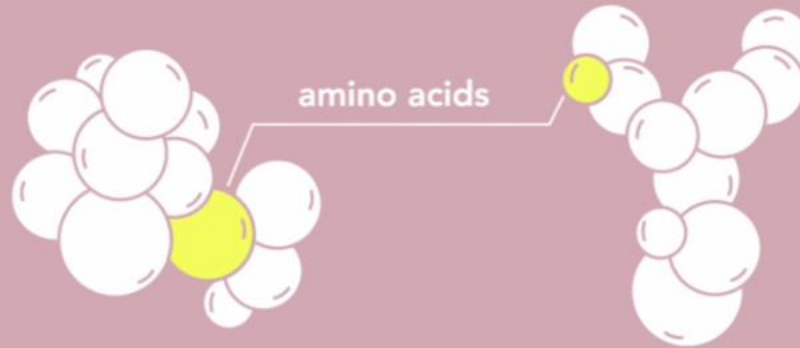
Capture



A protein may be compared to a necklace of beads
(one bead = one amino acid),
folded over onto itself.

There are 20 different amino acids.

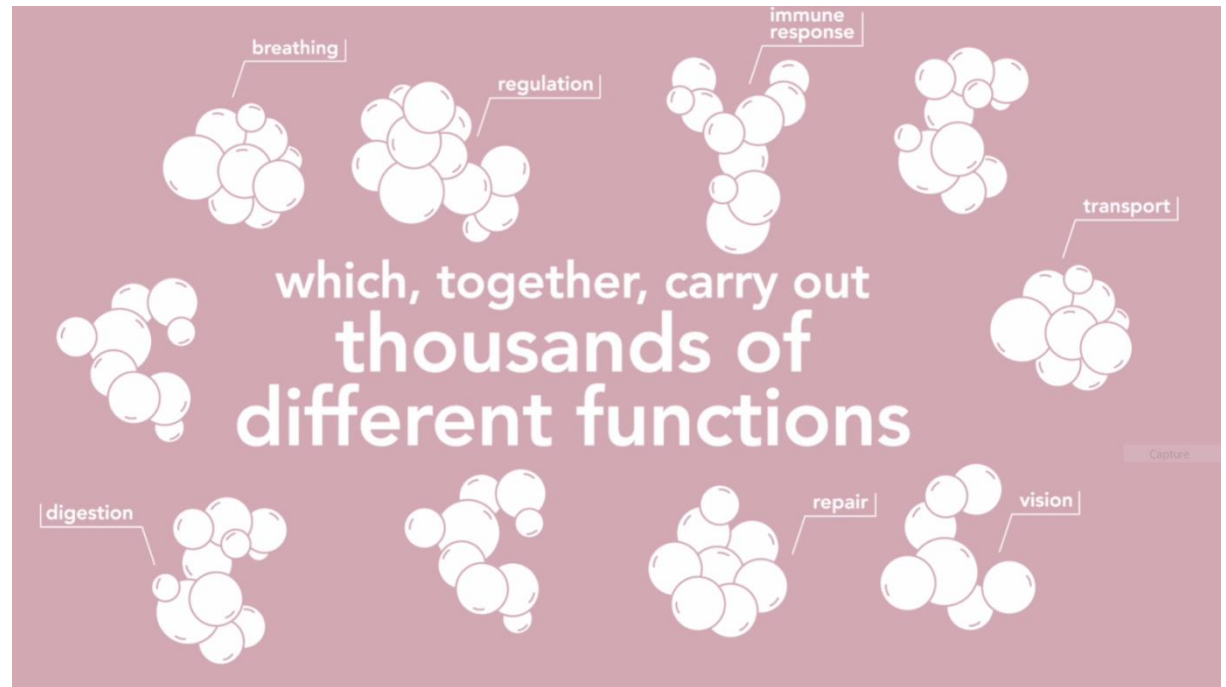
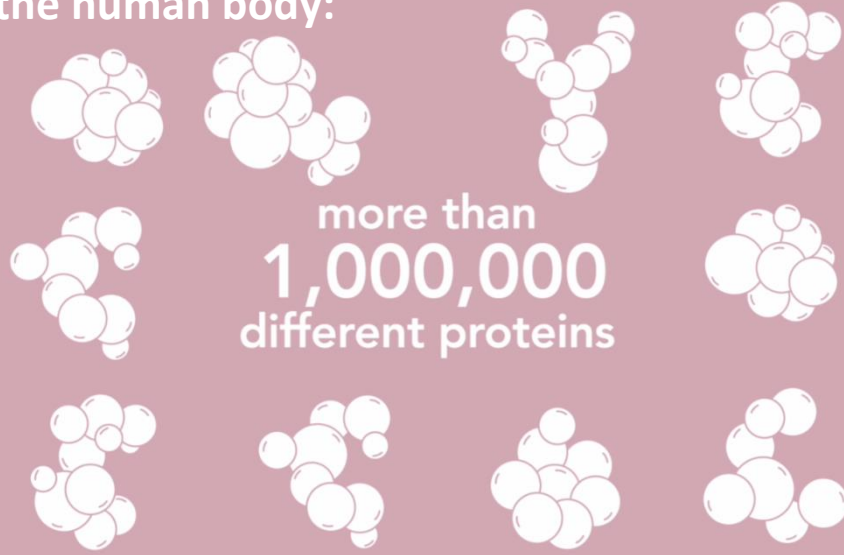
This protein
controls cell
division



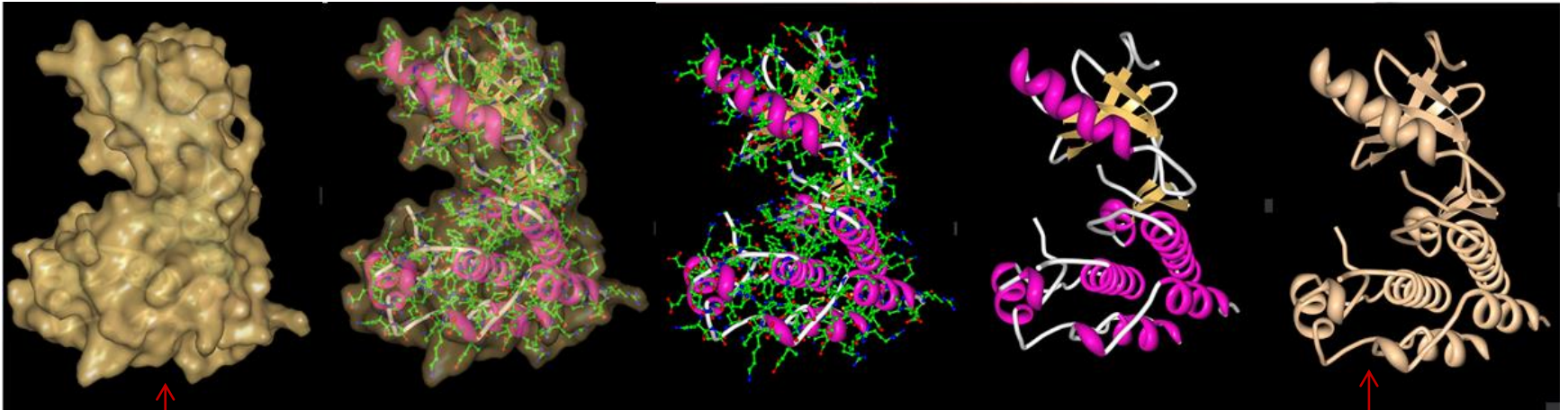
This protein is
an antibody

a protein's **function** depends
on its **composition**
(3D structure)

In the human body:



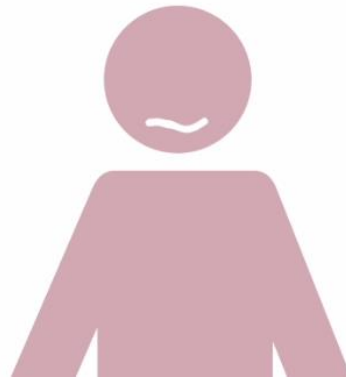
Different representations of the 3D structure of a protein (a necklace of amino acids)



the necklace's surface

the thread on which
the beads (amino
acids) are

someone
falls ill...



- Protein's active site is **altered** (mutated)
- there is **too little** of a protein
- there is **too much** of a protein



most of the time,
a drug targets
a protein



Capture

Antibiotics & Antivirals

1 2

Antibiotics and antiviral drugs are specific poisons. They need to kill pathogenic organisms like bacteria and viruses without poisoning the patient at the same time. Often, these drugs attack proteins that are only found in the targeted bacterium or virus and which are crucial for their survival or multiplication. For instance, penicillin attacks the enzyme that builds bacterial cell walls, and HIV protease inhibitors like saquinavir attack an enzyme that is needed for HIV maturation.

1. *D-alanyl-D-alanine carboxypeptidase with penicillin (1pwc)*
2. *HIV protease with saquinavir (1hxh)*

Anticancer Chemotherapy

3 4

Cancer cells grow and multiply without control. Since these cells are still similar to normal cells, it is difficult to kill them selectively with drugs that can't distinguish between the two. Many drugs currently used for cancer chemotherapy attack all growing cells, including cancer cells and normal cells. This causes the severe side effects of cancer chemotherapy, because the drugs attack rapidly-growing cells in hair follicles and the stomach. Two examples are shown here. Bleomycin attacks DNA in actively growing cells, often cleaving the DNA chain and killing the cell. Paclitaxel (Taxol) binds to tubulin, preventing the action of microtubules during cell division.

3. *DNA with bleomycin (1msk)*
4. *Tubulin with taxol (1jff)*



Drug Metabolism

5 6 7 8 9

You have probably noticed that when you take drugs, the effects gradually wear off in a few hours. Enzymes like cytochrome P450 continually search for drugs and destroy them. This is important because it protects us from poisonous molecules in our diet and in the environment, but it means that we have to take multiple doses of drugs when being treated for a disease.

9. *Cytochrome P450 3A4 with erythromycin (2j0d)*

Drugs of Signaling Proteins

5 6

Many drugs are designed to keep bodily processes at normal healthy levels. Much of the body's regulation is done through elaborate communications between cells, so some of the most widely prescribed drugs function by blocking the signaling proteins that allow cells to communicate. G protein-coupled receptors, which transmit signals across cell membranes, are targets for many drugs. For instance, the drug loratadine (Claritin) is used to treat allergies because it blocks the histamine receptor; losartan (Cozaar) is used to treat high blood pressure because it blocks the angiotensin II receptor; and carazolol is one of a large class of beta-blockers that bind to the adrenergic receptor, making it useful for treating heart disease. Signals can also be stopped by blocking the enzymes that create a signaling molecule. Aspirin blocks pain at the source by inhibiting the enzyme cyclooxygenase, which makes pain-signaling prostaglandin molecules.

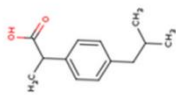
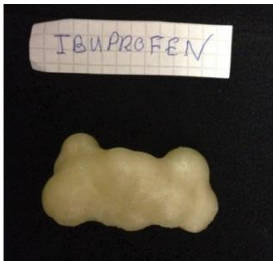
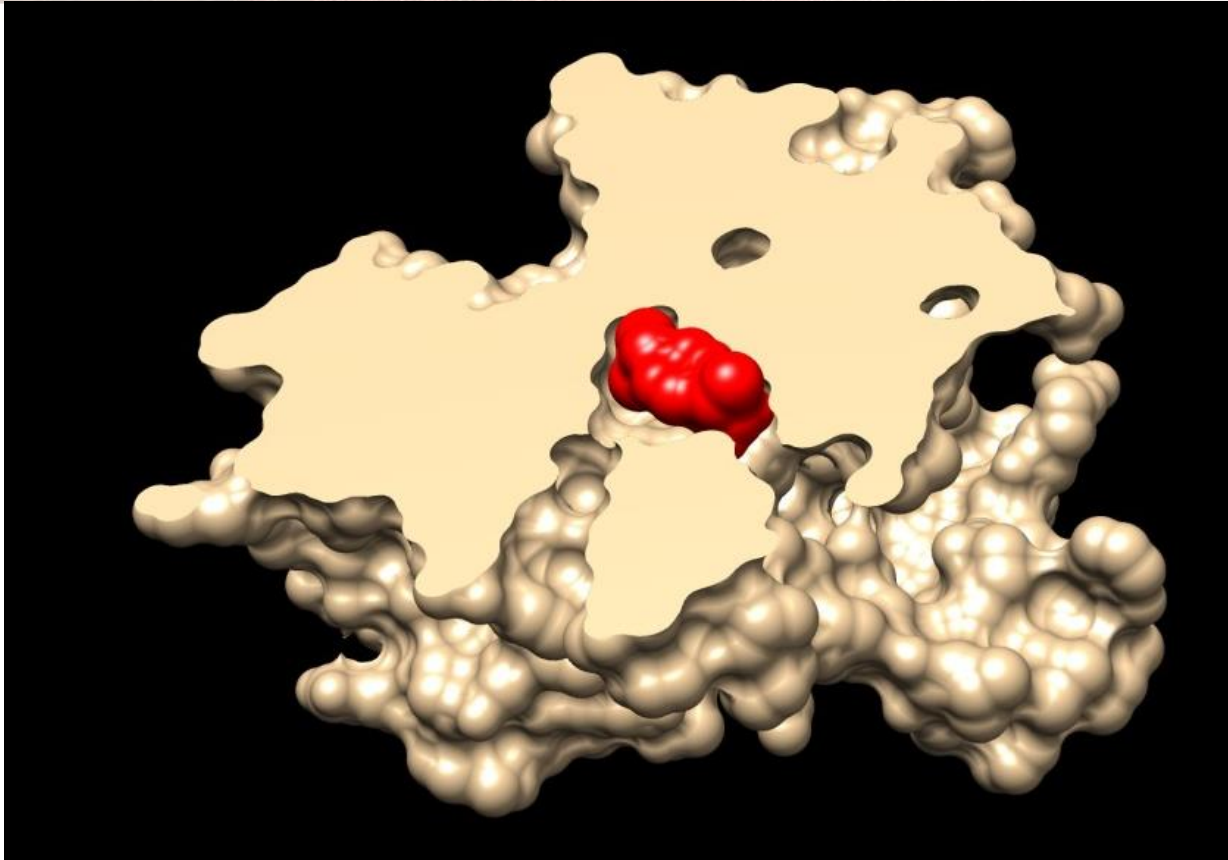
5. *Adrenergic receptor with carazolol (2rh1)*
6. *Prostaglandin H2 synthase with aspirin (1pth). The drug breaks into two pieces when it binds to the enzyme, and the smaller piece (an acetyl group) is attached to the enzyme with a covalent bond. The closeup shows the drug in one piece.*

Lifestyle Drugs

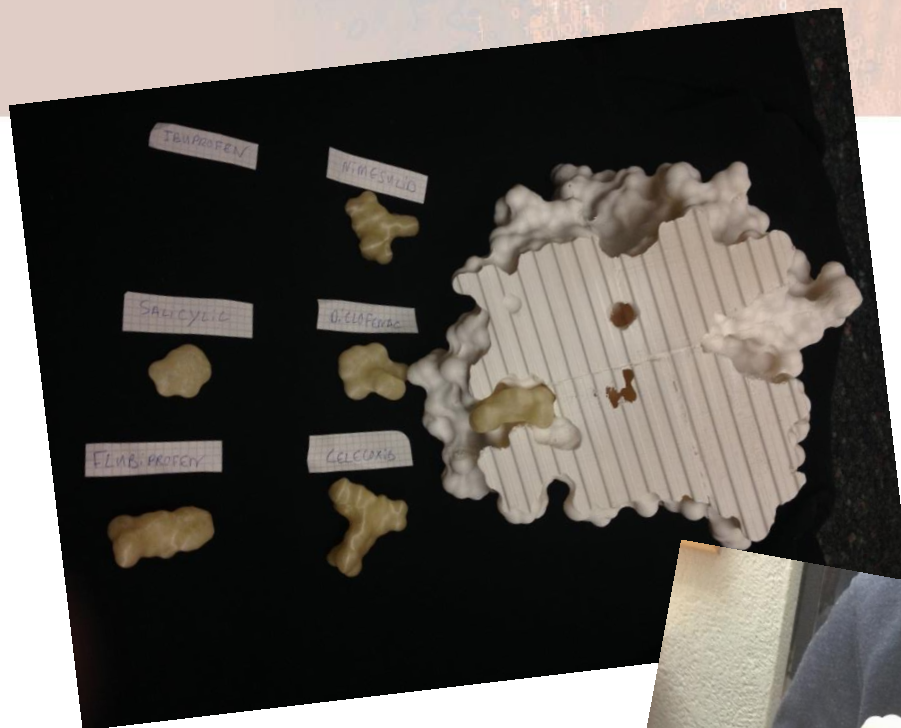
7 8

Pharmaceutical scientists have developed a number of drugs that help people modify their own health and bodily function. The drug orlistat (Xenical or alli) blocks the action of pancreatic lipase, and thereby reduces the amount of fat that is absorbed from food. Atorvastatin (Lipitor) and simvastatin (Zocor) lower cholesterol by blocking the action of HMG-CoA reductase, an enzyme involved in the synthesis of cholesterol. These drugs can be used, along with changes in diet and exercise, to help lose weight, regulate cholesterol levels, and control heart disease.

7. *Pancreatic lipase with an alkyl phosphonate inhibitor (1pb). The drug orlistat shown on the right is similar to the inhibitor found in the crystal structure.*
8. *HMG-CoA reductase with atorvastatin (1hwk)*



ibuprofen and COX1
(pain treatment)








Drug Design workshop

www.drug-design-workshop.ch


How do researchers design tomorrow's drugs?

 
COX, BRAF, IDO1
Workshops and
biological contexts

 Technical Help

 Additional Video Documents


a workshop on
DRUG DESIGN,
or how to design
tomorrow's medicine

 A video to introduce the main Drug Design concepts

Have a try to design a drug...


anti-inflammatory
(COX)

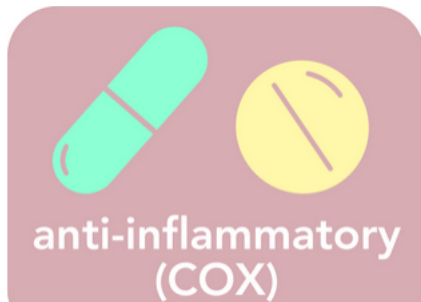

against skin
cancer (BRAF)


against cancer
(IDO1)

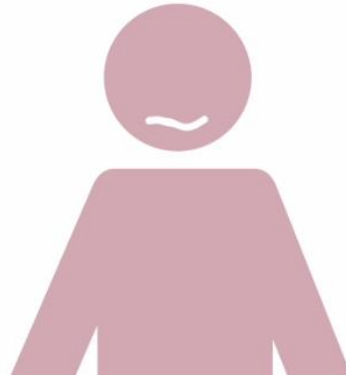
COX workshop



Have a try to design a drug...



someone
falls ill...



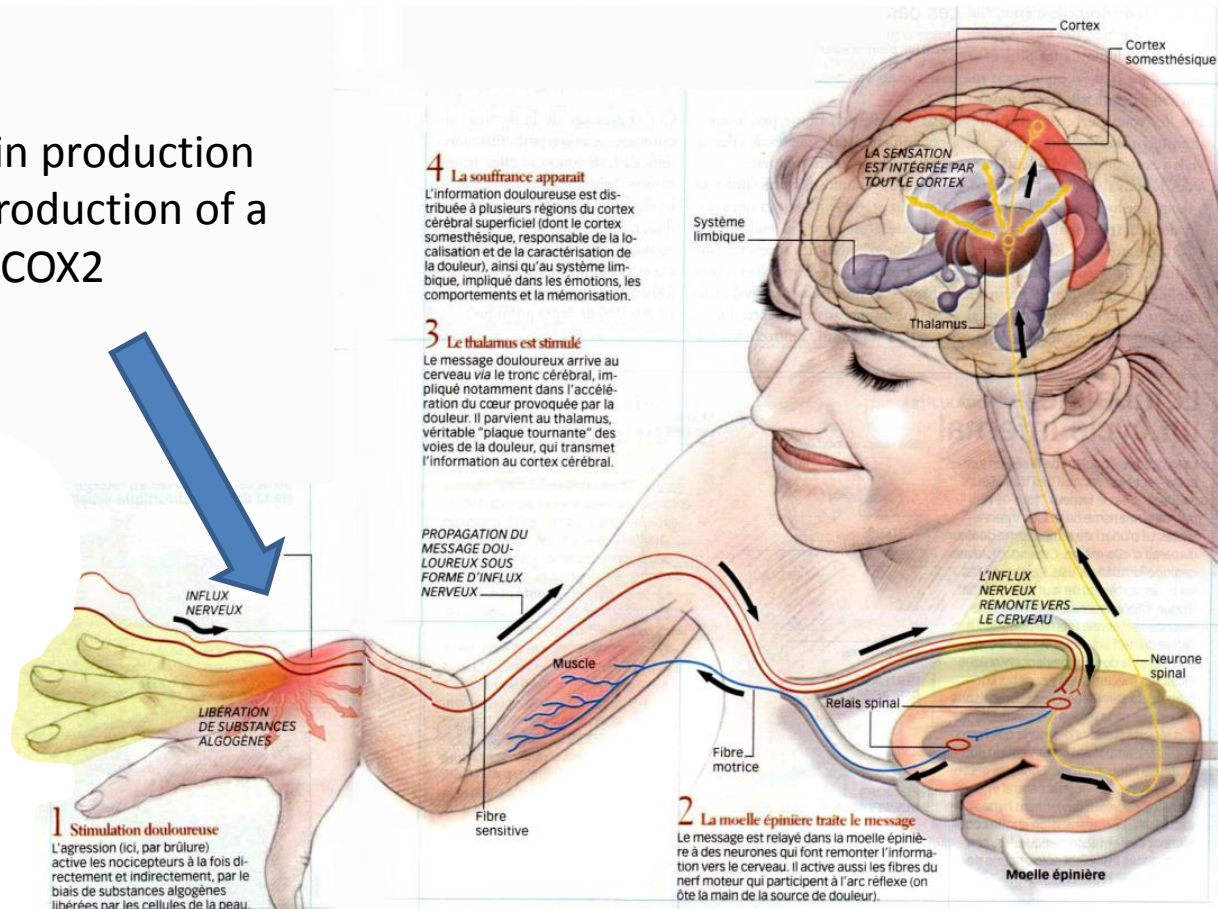
- Protein's active site is **altered** (mutated)
- there is **too little** of a protein
- there is **too much** of a protein

anti-inflammatory drugs

More often than not, pain is the result of excessive prostaglandin production due to the local high production of a protein called COX2*

* Also called **Prostaglandin G/H synthase 2 (PTGS2)**

excessive prostaglandin production
due to the local high production of a
protein called COX2



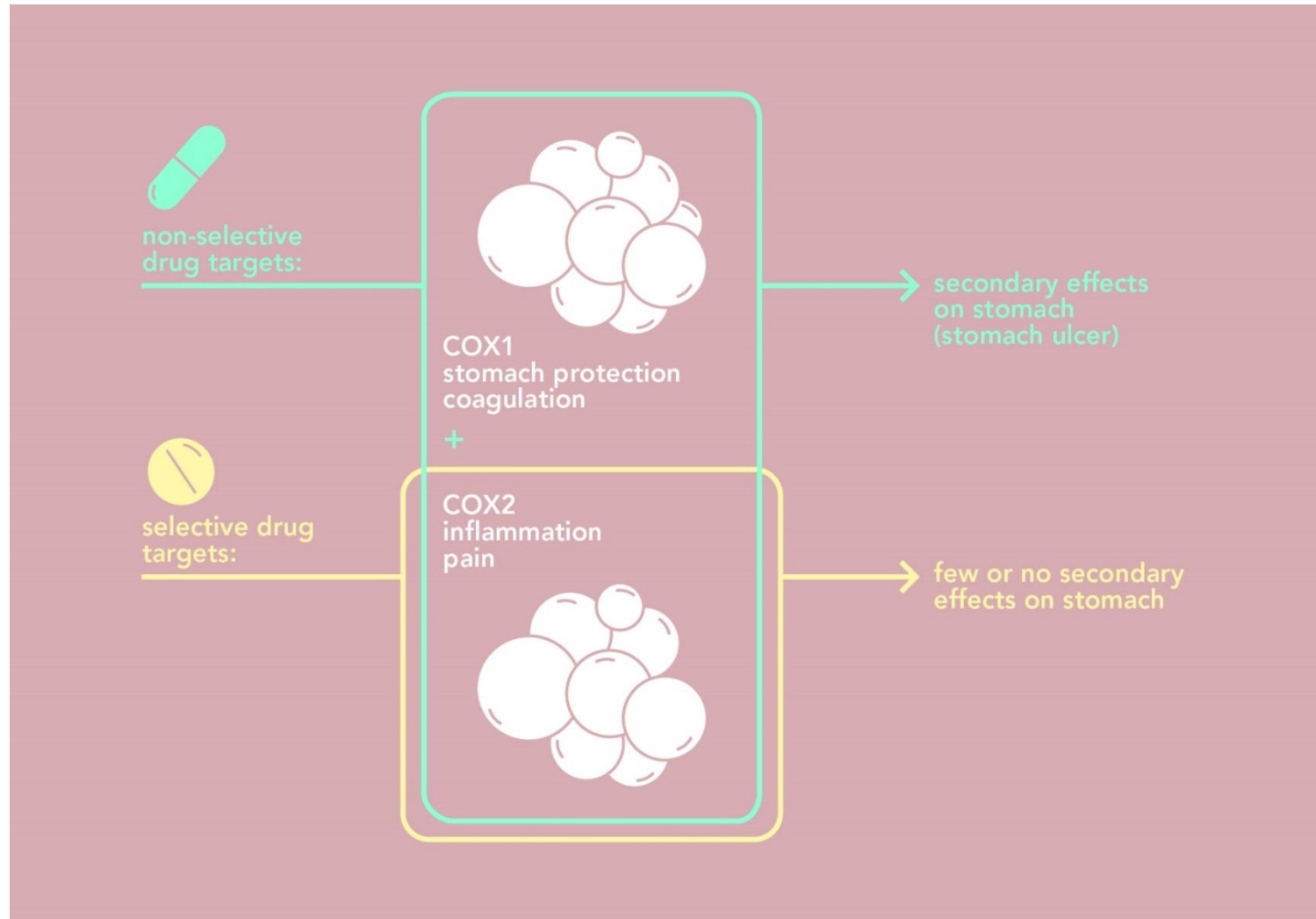
The challenge COX1 and COX 2



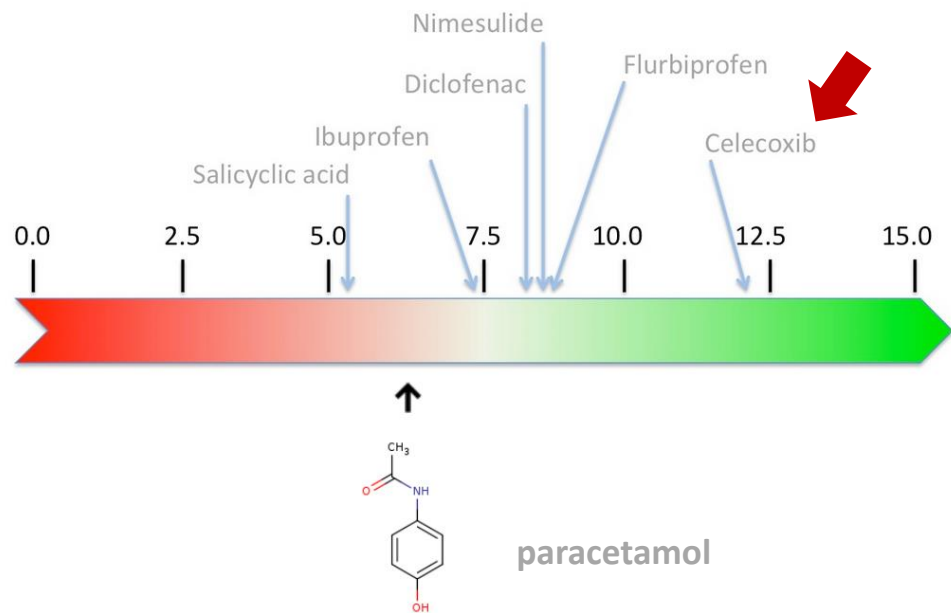
COX1 is expressed constitutively and produces prostaglandins to fine-tune **physiological processes**

COX2 is inducible and typically produces prostaglandins that mediate responses to **physiological stresses** such as infection and inflammation

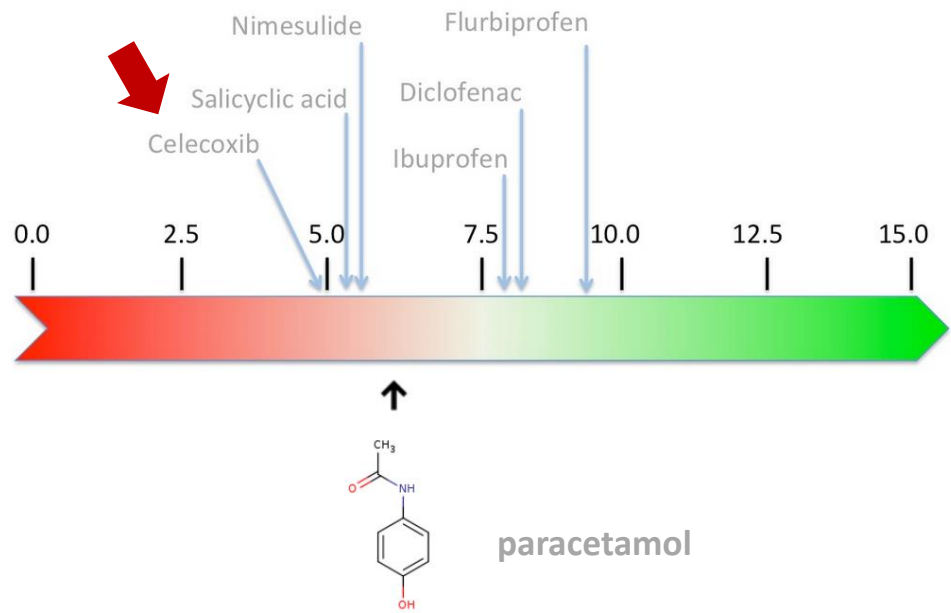
The challenge COX1 and COX 2



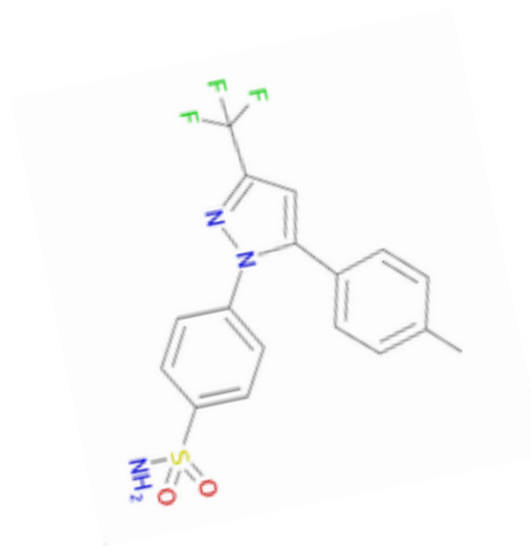
Affinity for COX2



Affinity for COX1




Find a molecule with a higher affinity for COX2 compared to COX1 (i.e. Celecoxib)...



Celecoxib is a selective inhibitor of COX2 and belongs to the « coxibs » family, which was put on the market in 2000. It is used to treat rheumatic diseases (arthrosis and rheumatoid polyarthritis). It does not inhibit COX1 and has no side effects on the stomach. As a precaution, celecoxib is not a first-choice treatment because other coxibs family molecules seem to be toxic for the heart.



Have a try to design a drug...



anti-inflammatory
(COX)

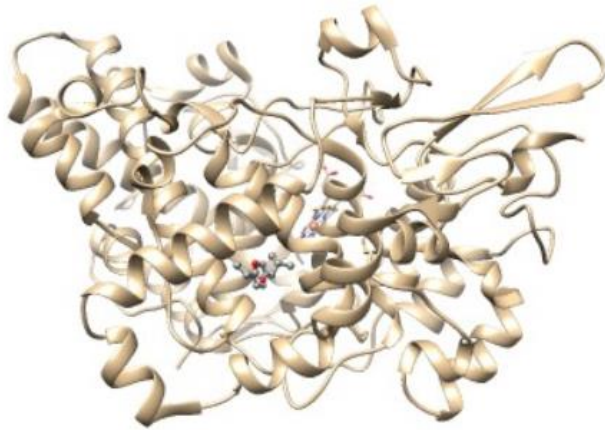


against skin
cancer (BRAF)

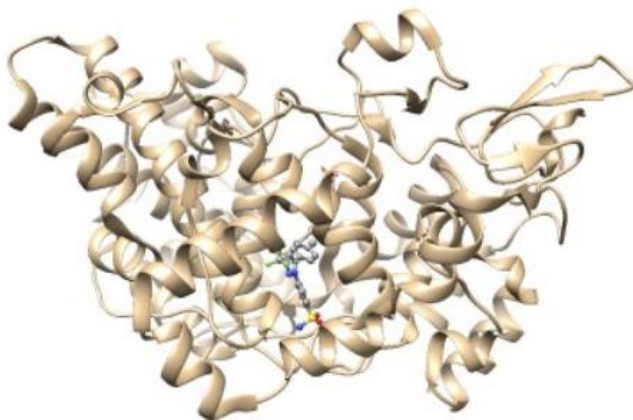


against cancer
(IDO1)

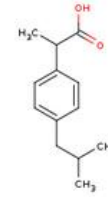
COX1



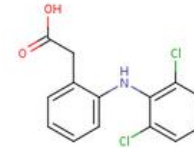
COX2



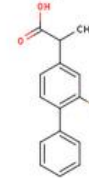
Ibuprofen



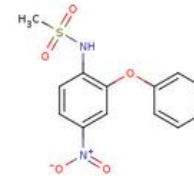
Diclofenac



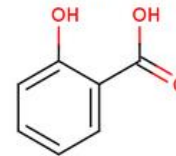
Flurbiprofen



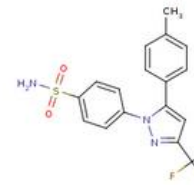
Nimesulide



Salicylic acid

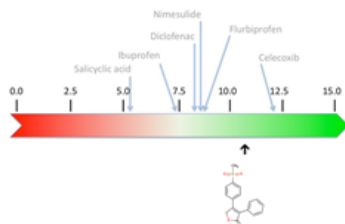


Celecoxib



Dessinez
votre propre
molécule

2. visualize its binding mode and estimate its affinity for the target protein (compare the score with existing drugs)

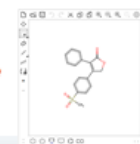
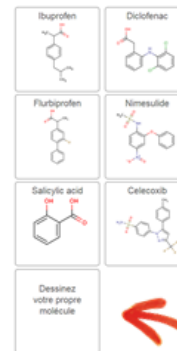
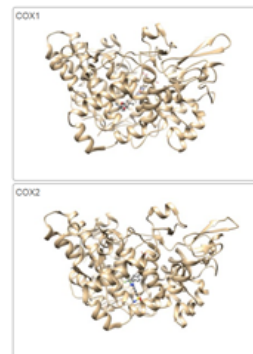


a molecular docking simulation (AutoDock Vina) predicts the binding mode and compares molecule-protein affinity with existing drugs (score)

3. predict possible targets (SwissTargetPrediction)

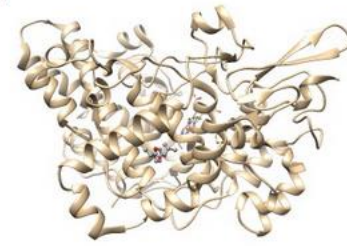
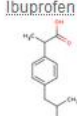

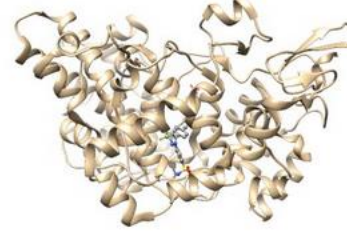
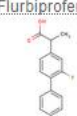

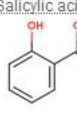
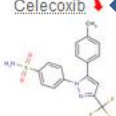
4. predict important properties of the molecule in order to evaluate its potential of becoming a drug (SwissADME)

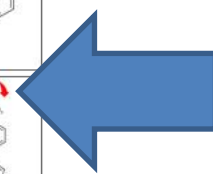
1. Draw a new molecule



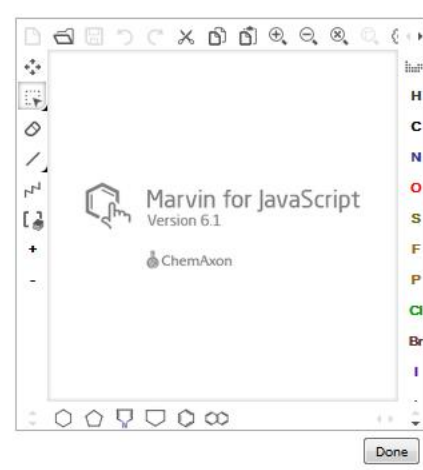
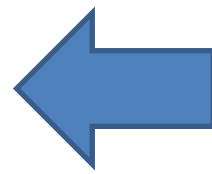
Target	Common Name	Uniprot ID	ChEMBL ID	Probability	# of hits	Target Class
Prostaglandin synthase 1	PTGS1	P12916	DB048627	0.97	10	Enzyme
COX-2	PTGS2	P42934	DB048628	0.97	10	Enzyme
Prostaglandin synthase 2	PTGS2	P42934	DB048628	0.97	10	Enzyme
Calcitonin receptor-like receptor 1	CLR1	P19441	DB048629	0.97	10	Enzyme
Calcitonin receptor-like receptor 2	CLR2	P19442	DB048630	0.97	10	Enzyme
Calcitonin receptor-like receptor 3	CLR3	P19443	DB048631	0.97	10	Enzyme
Calcitonin receptor-like receptor 4	CLR4	P19444	DB048632	0.97	10	Enzyme
Calcitonin receptor-like receptor 5	CLR5	P19445	DB048633	0.97	10	Enzyme
Calcitonin receptor-like receptor 6	CLR6	P19446	DB048634	0.97	10	Enzyme
Calcitonin receptor-like receptor 7	CLR7	P19447	DB048635	0.97	10	Enzyme
Calcitonin receptor-like receptor 8	CLR8	P19448	DB048636	0.97	10	Enzyme
Calcitonin receptor-like receptor 9	CLR9	P19449	DB048637	0.97	10	Enzyme
Calcitonin receptor-like receptor 10	CLR10	P19450	DB048638	0.97	10	Enzyme

Property	Value
Log P (XLOGP3)	0.42
Log P (SILICO)	0.42
Log P (MOPAC)	0.42
Log P (ALOGP)	0.42
Log P (XLOGP2)	0.42
Log P (SILICO2)	0.42
Log P (MOPAC2)	0.42
Log P (ALOGP2)	0.42
Log P (XLOGP3)	0.42
Log P (SILICO)	0.42
Log P (MOPAC)	0.42
Log P (ALOGP)	0.42
Log P (XLOGP2)	0.42
Log P (SILICO2)	0.42
Log P (MOPAC2)	0.42
Log P (ALOGP2)	0.42
Log P (XLOGP3)	0.42
Log P (SILICO)	0.42
Log P (MOPAC)	0.42
Log P (ALOGP)	0.42
Log P (XLOGP2)	0.42
Log P (SILICO2)	0.42
Log P (MOPAC2)	0.42
Log P (ALOGP2)	0.42

<p>COX1</p> 	<p>Ibuprofen</p> 	<p>Diclofenac</p> 
<p>COX2</p> 	<p>Flurbiprofen</p> 	<p>Nimesulide</p> 
	<p>Salicylic acid</p> 	<p>Celecoxib</p> 
	<p>Design your own molecule</p>	

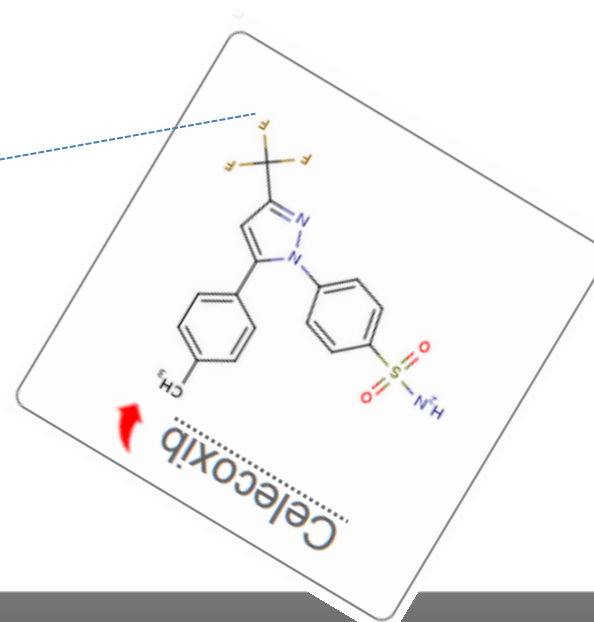
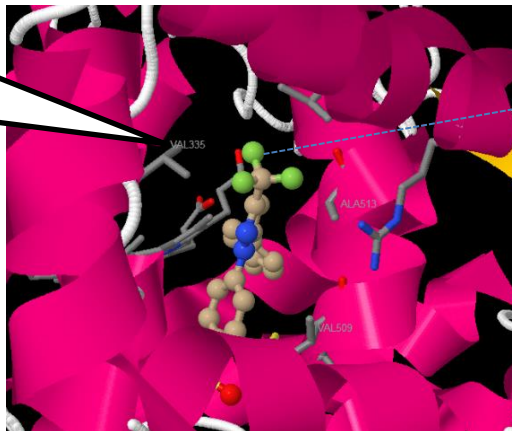


draw a new molecule
or
'improve' an existing molecule

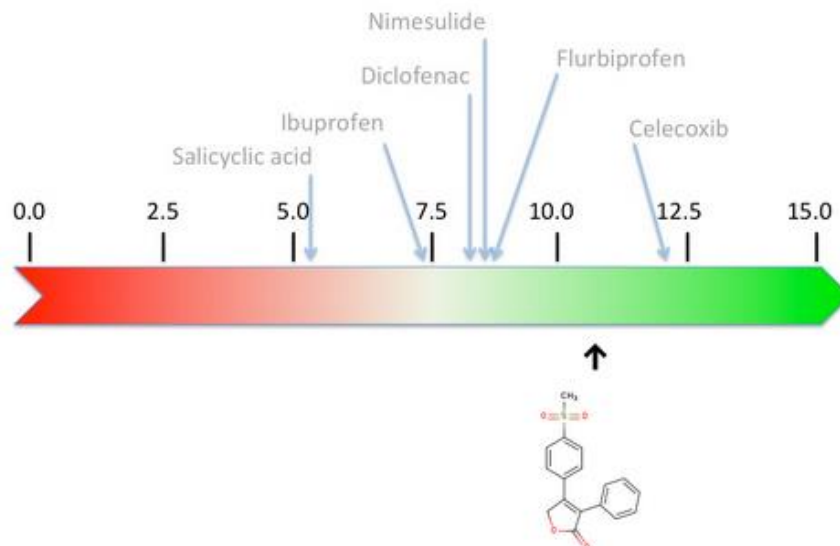
- ✓ **Docking computation is launched on a remote computer thanks to the Internet**
- ✓ Tens of thousands of different geometries and positions of the ligand in the protein are evaluated!
- ✓ The most probable position is shown in 3D (the amino acids interacting with the molecule are named) and an affinity score is provided

Amino acid at position 335 is a Valine, which interacts with Celecoxib



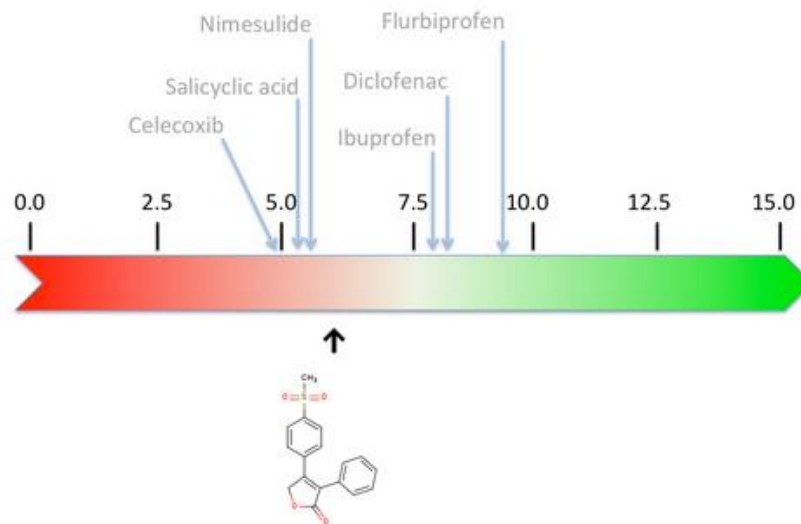
Docking and scores - COX2

Your molecule has a score of: 10.7

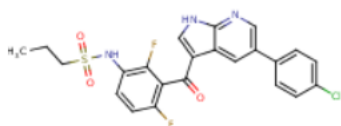


Docking and scores - COX1

Your molecule has a score of: 6



Query Molecule



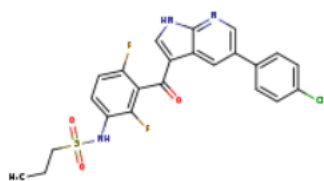
SwissTarget Prediction compares your molecules (at the 2D and 3D structure levels) with 280,000 other molecules known to be active on 2,000 proteins.

'similar molecules are prone to exhibiting similar biological activities'

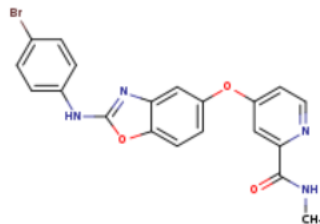
Retrieve data: 

Ligands of RAF proto-oncogene serine/threonine-protein kinase (RAF1) with 3D-based similarity ;

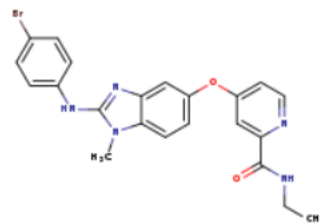
CHEMBL1229517
Similarity: 0.992



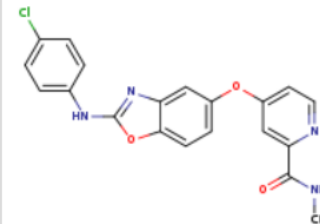
CHEMBL1778393
Similarity: 0.814



CHEMBL470359
Similarity: 0.792



CHEMBL1162958
Similarity: 0.788



See later: how to compare molecules (molecular fingerprint)

Aspirin



Swiss Institute of
Bioinformatics

SwissTargetPrediction

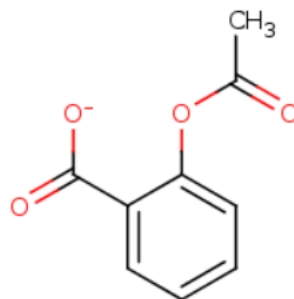
[Home](#) [FAQ](#) [Help](#) [Download](#) [Contact](#) [Disclaimer](#)

List of predicted targets

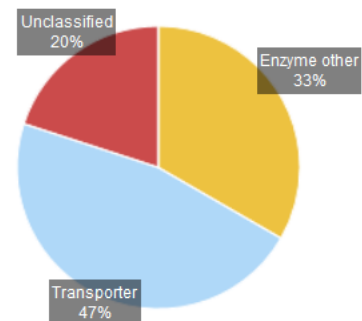
These targets have been predicted using the method described in:

Gfeller D., Michielin O. & Zoete V.
Shaping the interaction landscape of
bioactive molecules, *Bioinformatics* (2013)
29:3073-3079.

Query Molecule



General Target Classes



Retrieve data:



Target	Common name	Uniprot ID	ChEMBL ID	Probability	# sim. cmpds (3D / 2D)	Target Class
Prostaglandin G/H synthase 1	PTGS1	P23219	CHEMBL221	<div style="width: 100%; height: 10px; background-color: green;"></div>	1 / 4	Enzyme
Prostaglandin G/H synthase 2	PTGS2	P35354	CHEMBL230	<div style="width: 100%; height: 10px; background-color: green;"></div>	1 / 4	Enzyme
Sodium-dependent noradrenaline transporter	SLC6A2	P23975	CHEMBL222	<div style="width: 66%; height: 10px; background-color: green;"></div>	2 / 3	Transporter
Sodium-dependent serotonin transporter	SLC6A4	P31645	CHEMBL228	<div style="width: 50%; height: 10px; background-color: green;"></div>	2 / 2	Transporter
Sodium- and chloride-dependent glycine transporter 1 (<i>by homology</i>)	SLC6A9	P48067	CHEMBL2337	<div style="width: 50%; height: 10px; background-color: green;"></div>	2 / 4	Transporter
Sodium-dependent dopamine transporter	SLC6A3	Q01959	CHEMBL238	<div style="width: 66%; height: 10px; background-color: green;"></div>	2 / 3	Transporter



Swiss Institute of
Bioinformatics

SwissTargetPrediction

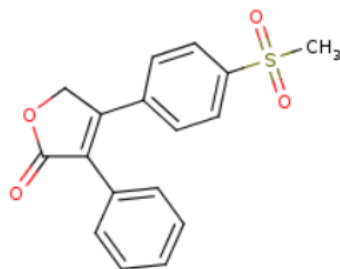
[Home](#) [FAQ](#) [Help](#) [Download](#) [Contact](#) [Disclaimer](#)

List of predicted targets

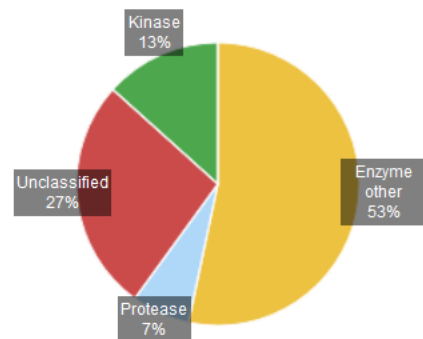
These targets have been predicted using the method described in:

Gfeller D., Michielin O. & Zoete V.
Shaping the interaction landscape of bioactive molecules, *Bioinformatics* (2013) 29:3073-3079.

Query Molecule



General Target Classes

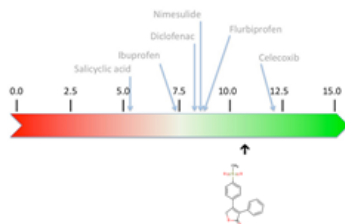
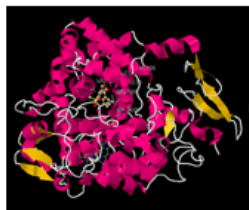


Retrieve data:



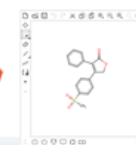
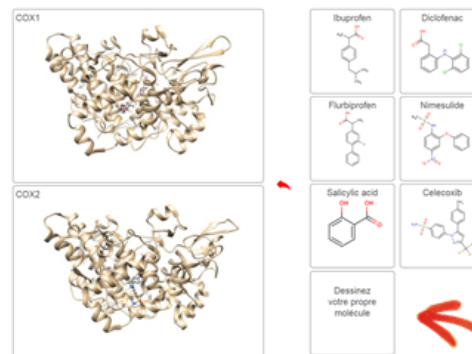
Target	Common name	Uniprot ID	ChEMBL ID	Probability*	# sim. cmpds (3D / 2D)	Target Class
Prostaglandin G/H synthase 1	PTGS1	P23219	CHEMBL221	<div style="width: 100%; height: 15px; background-color: green;"></div>	377 / 121	Enzyme
Lipid-phosphate phosphatase	EPHX2	P34913	CHEMBL2409	<div style="width: 100%; height: 15px; background-color: green;"></div>	95 / 1	Serine Protease
Prostaglandin G/H synthase 2	PTGS2	P35354	CHEMBL230	<div style="width: 100%; height: 15px; background-color: green;"></div>	377 / 121	Enzyme
Cytochrome P450 19A1	CYP19A1	P11511	CHEMBL1978	<div style="width: 75%; height: 15px; background-color: green;"></div>	263 / 3	Enzyme
Muscleblind-like protein 1	MBNL1	Q9NR56	CHEMBL1293317	<div style="width: 25%; height: 15px; background-color: green;"></div>	907 / 3	Unclassified
Muscleblind-like protein 2 (by homology)	MBNL2	Q5VZF2		<div style="width: 25%; height: 15px; background-color: green;"></div>	907 / 3	Unclassified
Muscleblind-like protein 3 (by homology)	MBNL3	Q9NUK0		<div style="width: 25%; height: 15px; background-color: green;"></div>	907 / 3	Unclassified

2. visualize its binding mode and estimate its affinity for the target protein (compare the score with existing drugs)



a molecular docking simulation (AutoDock Vina) predicts the binding mode and compares molecule-protein affinity with existing drugs (score)

1. Draw a new molecule

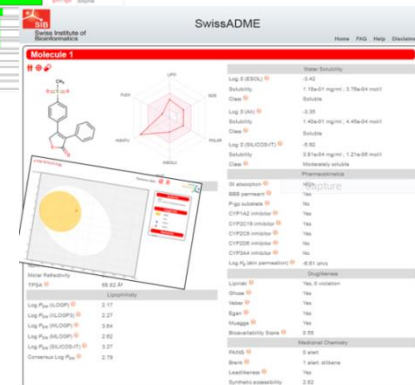


3. predict possible targets (SwissTargetPrediction)

Target	Common Name	UniProt ID	ChEMBL ID	Probability	# of Active Sites	Target Class
Prostaglandin synthase 1	PTGS1	P23276	ChEMBL_271	0.97	1	Enzyme
COX-2	PTGS2	P23277	ChEMBL_249	0.97	1	Enzyme
Prostaglandin synthase 2	PTGS2	P23277	ChEMBL_249	0.97	1	Enzyme
Cyclooxygenase 1	PTGS1	P23276	ChEMBL_271	0.97	1	Enzyme
Cyclooxygenase 2	PTGS2	P23277	ChEMBL_249	0.97	1	Enzyme
COX-2	PTGS2	P23277	ChEMBL_249	0.97	1	Enzyme
COX-1	PTGS1	P23276	ChEMBL_271	0.97	1	Enzyme
COX-2	PTGS2	P23277	ChEMBL_249	0.97	1	Enzyme
COX-1	PTGS1	P23276	ChEMBL_271	0.97	1	Enzyme
COX-2	PTGS2	P23277	ChEMBL_249	0.97	1	Enzyme

Iterative approach

4. predict important properties of the molecule in order to evaluate its potential of becoming a drug (SwissADME)



www.SwissADME.ch

Predict important properties of the molecule
in order to evaluate its potential of
becoming a drug to be taken orally

Absorption, Distribution, Metabolism, Excretion

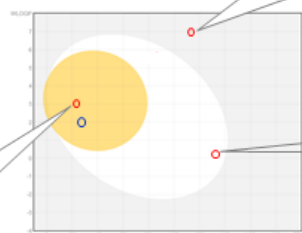
evaluate the potential of a molecule of becoming a drug absorption, distribution, metabolism and excretion (SwissADME)

For designing, discovering or developing a therapeutically relevant molecule, potency and selectivity to the target protein is only one side of the problem. Indeed **absorption, distribution, metabolism, and excretion (ADME)** must be optimized for the molecule to reach its tissue/target in sufficient amount and to **reduce off-target and unwanted effects**. Aim: design a drug which can be taken orally, for the patient's comfort and compliance.

The Brain Or Intestinal, Estimated permeation method (BOILED-Egg) helps efficiently to apprehend the concepts of absorption and distribution (gastro-intestinal tract or blood brain barrier)

It is described by the n -octanol/water partition coefficient (WLOGP), lipophilicity and the polar surface area (TPSA), polarity.

Hide BOILED-Egg



Inside the yellow part of the BOILED Egg
The molecule is predicted to passively permeate the blood brain barrier (BBB)
• Red dot: It might stay in the brain
• Blue dot: as a substrate of the P-gp protein, the molecule might be expelled from the brain

Oral dosing is highly preferred for the patient's comfort and compliance. Bioavailability is multifactorial, but is primarily driven by gastro-intestinal absorption (HIA).

Outside the BOILED Egg, the molecule is predicted to be not well absorbed by the GI tract when taken orally

Inside the white part of the BOILED Egg
The molecule is predicted to be passively absorbed by the gastro-intestinal tract (HIA)

Score's representation of some important chemical properties (Lipophilicity, Size, Polarity, insaturation, Flexibility)
A good candidate: Low Lipophilicity, Small Size, High Polarity, Low Insaturation, Low Flexibility

The simplified molecular input line-entry system (SMILES) is a specification in form of a line notation for describing the structure of chemical species using short ASCII strings.

Physicochemical Properties
Topological Polar Surface Area (TPSA)
Low TPSA (<100): moderate apparent polarity
-> well absorbed by the GI tract when taken orally
-> prone to cross the Blood-Brain Barrier to enter the Central Nervous system (CNS)

Lipophilicity
High LogP (lipophilicity) (> 0 lipophile)
-> oxidation-prone by the cytochromes CYP450
-> tendency to be extensively bound to plasma proteins

Molecule 1

SMILES: Cc1ccc(cc1)N(C)C(=O)Nc2ccc(cc2)S(=O)(=O)N

Physical Chemical Properties	
Formula	C17H14F3NO6S
Molecular weight	381.37 g/mol
Num. heavy atoms	26
Num. arom. heavy atoms	17
Fraction Csp3	0.12
Num. rotatable bonds	4
Num. H-bond acceptors	7
Num. H-bond donors	1
Molar Refractivity	89.96
TPSA	96.36 Å²

Lipophilicity	
Log P _{ow} (LOGP)	2.56
Log P _{ow} (LOGP5)	3.40
Log P _{ow} (WLOGP)	5.75
Log P _{ow} (MLOGP)	2.65
Log P _{ow} (SILICOLOGP)	2.63
Consensus Log P _{ow}	3.40

Water Solubility	
Log S (ESOL)	-4.57
Solubility	1.04e-02 mg/ml; 2.71e-05 mol/l
Class	Moderately soluble
Log S (A8)	-4.89
Solubility	4.88e-03 mg/ml; 1.29e-05 mol/l
Class	Moderately soluble
Log S (SILICOLOGP)	-4.32
Solubility	2.29e-04 mg/ml; 6.01e-07 mol/l
Class	Poorly soluble

Pharmacokinetics	
GI absorption	High
BBB permeant	No
P-gp substrate	No
CYP1A2 inhibitor	Yes
CYP2C19 inhibitor	No
CYP2C9 inhibitor	Yes
CYP2D6 inhibitor	No
CYP3A4 inhibitor	No
Log K ₁₂ (skin permeation)	-4.21 cm/s

Druglikeness	
Lipinski	Yes: 0 violation
Glaxo	No: 1 violation; WLOGP>5.6
Veber	Yes
Egan	Yes
Murgalj	Yes
Bioavailability Score	0.55

Medicinal Chemistry	
PAINS	0 alert
Brenk	0 alert
Leadlikeness	No: 1 violation; MW>350
Synthetic accessibility	2.74

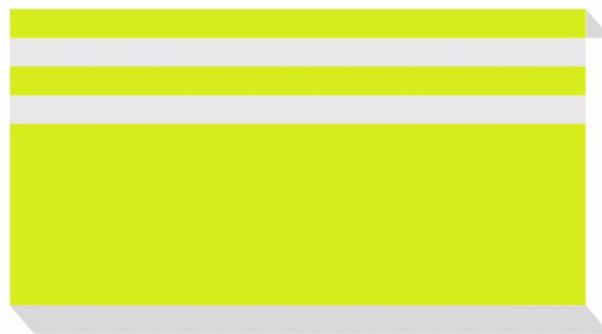
Water Solubility
A molecule which is poorly soluble
-> potential problems for dose formulation
-> small amount excreted by kidney

Pharmacokinetics
Gastro intestinal (GI) absorption
Blood Brain Barrier (BBB) permeant
Substrate of the protein P-gp which expels molecule from the brain
CYP: substrate of different cytochromes (in the liver). N.B. 2 drugs which are the substrates of the same cytochrome should not be taken simultaneously
Skin permeation: yes if the score is > -5

Druglikeness
If a molecule is considered as a druglike molecule, it might be suited for oral administration

Medicinal Chemistry
Alert: presence of a problematic structural fragment (toxic, ...)
Synthetic Accessibility Score (on a scale from 1 (easy to make) to 10 (very difficult to make))
-> if the score is low, the molecule is suited for biological screening activities

- ✓ 10^{60} molecules (potential)
 - ✓ 35 millions of existing molecules (<http://zinc.docking.org/>)
 - ✓ 2,000 molecules are drugs approved by the FDA
 - ✓ 280,000 molecules are known to be active on 2,000 target proteins (SwissTarget)
- ✓ More than 10 years to find a new drug....including at least 2 years of *'in silico'* analysis...

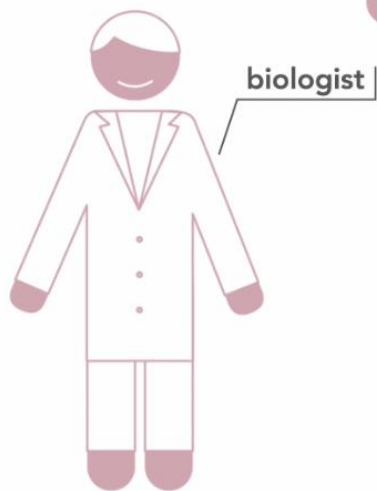
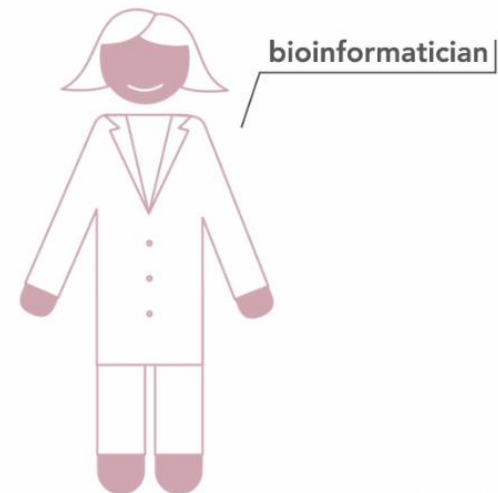
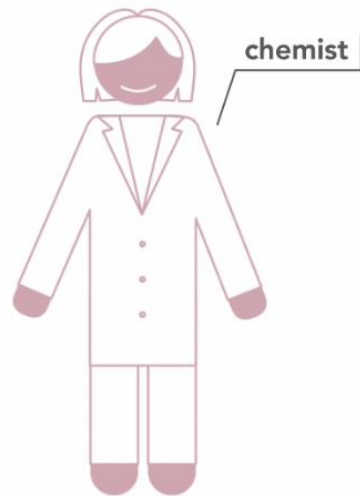


dozens
of new molecules on
the market every year

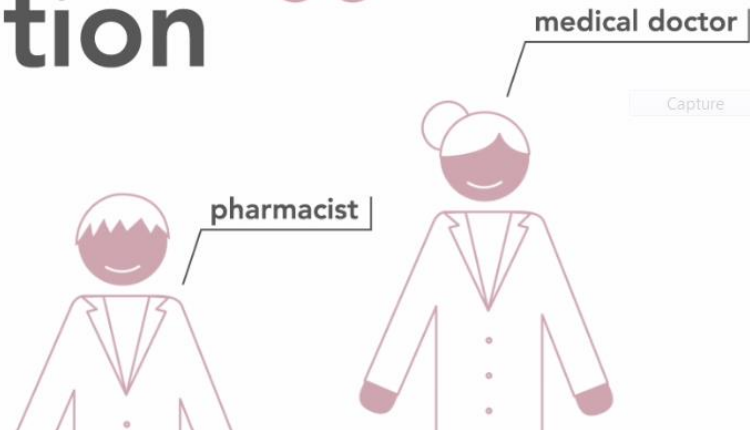
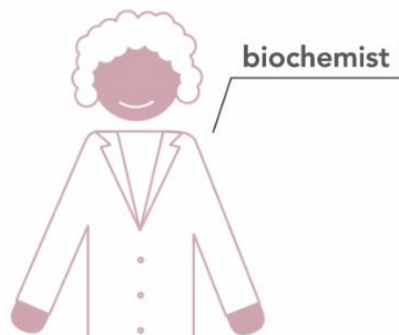
thousands
of ongoing projects

cost of a project:
1 billion
dollars

thousands
of small molecules and
only one is chosen



continuous collaboration



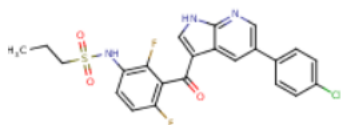
Capture

BONUS

How to search for molecule similarity?

Molecular Fingerprint

Query Molecule



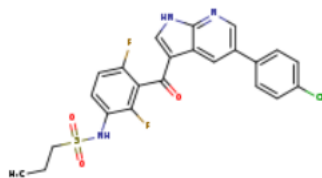
SwissTarget Prediction compares your molecules (at the 2D and 3D structure levels) with 280,000 molecules known to be active on 2,000 proteins.

'similar molecules are prone to exhibiting similar biological activities'

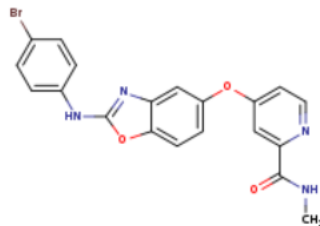
Retrieve data:

Ligands of RAF proto-oncogene serine/threonine-protein kinase (RAF1) with 3D-based similarity ;

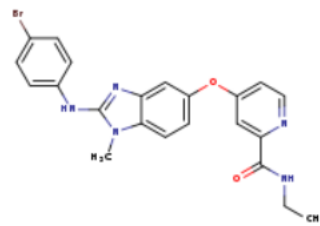
CHEMBL1229517
Similarity: 0.992



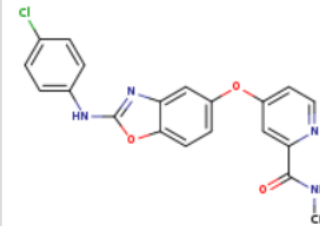
CHEMBL1778393
Similarity: 0.814



CHEMBL470359
Similarity: 0.792



CHEMBL1162958
Similarity: 0.788



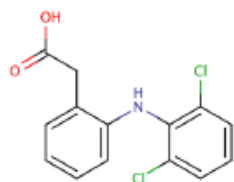
See later: how to compare **molecules** (molecular fingerprint)

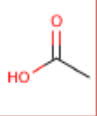
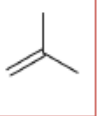
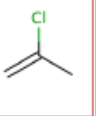
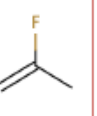
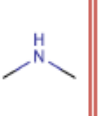
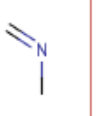

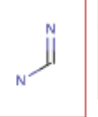
How to compare molecules -> Molecular fingerprints

Molecular fingerprints is a technique that compares molecules by describing a chemical structure as a vector of 0 and 1 (a bit string)

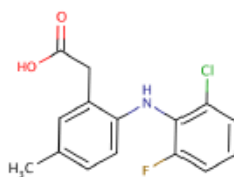
- (i) establish a short list of molecular features (e.g. chemical functions or combination of bound atoms);
- (ii) for each molecule, either put a 1 in the correct position of a vector if a given feature is found in the molecule, or a 0 .
- (iii) Create the fingerprint vectors for several molecules, and then calculate the Tanimoto coefficients
- (iv) Comparison of Tanimoto coefficient values and known biological activities will then illustrate the assumption that **similar molecules are prone to having similar biological activities**

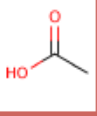
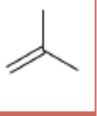
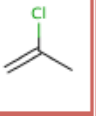
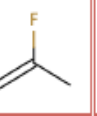
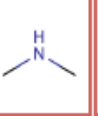
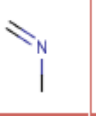

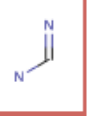
Diclofenac



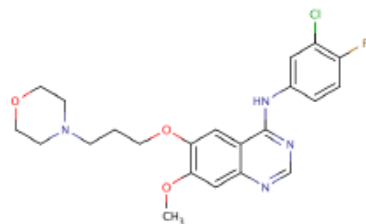
							
1	1	1	0	1	0	0	0

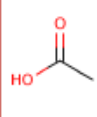
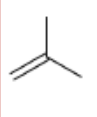
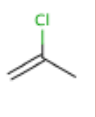
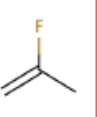
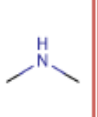
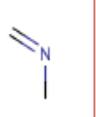
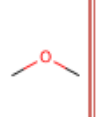
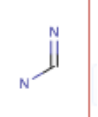
Lumiracoxib



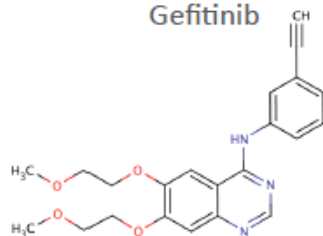
							

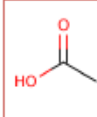
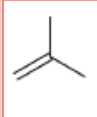
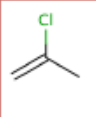
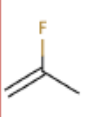
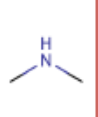
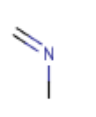
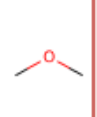
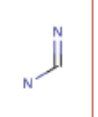
Erlotinib



Gefitinib



Calcul de similarité Coefficient de Tanimoto

$$T = \frac{M_{11}}{M_{11} + M_{10} + M_{01}}$$

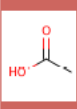
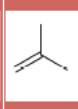
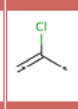
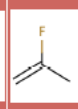
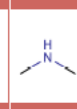
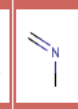
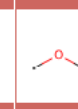
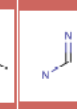
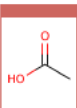
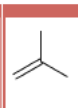
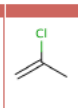
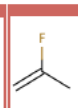
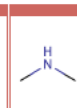
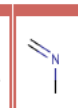
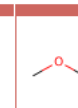
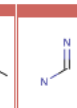
M_{11} : nombre de cases où l'on trouve 1 à la fois chez A et chez B

M_{10} : nombre de cases où l'on trouve 1 chez A et 0 chez B

M_{01} : nombre de cases où l'on trouve 0 chez A et 1 chez B

$0 \leq T \leq 1$ $T = 0$: molécules totalement différentes
 $T = 1$: molécules identiques

Exemple:

A								
	1	1	1	0	1	0	0	0
B								
	1	1	0	1	1	0	0	1

$$M_{11} = 3$$

$$M_{10} = 1$$

$$M_{01} = 2$$



$$T = \frac{3}{3+1+2} = 0.5$$

Calcul de similarité Coefficient de Tanimoto

$$T = \frac{M_{11}}{M_{11} + M_{10} + M_{01}}$$

M_{11} : nombre de cases où l'on trouve 1 à la fois chez A et chez B

M_{10} : nombre de cases où l'on trouve 1 chez A et 0 chez B

M_{01} : nombre de cases où l'on trouve 0 chez A et 1 chez B

$$0 \leq T \leq 1$$

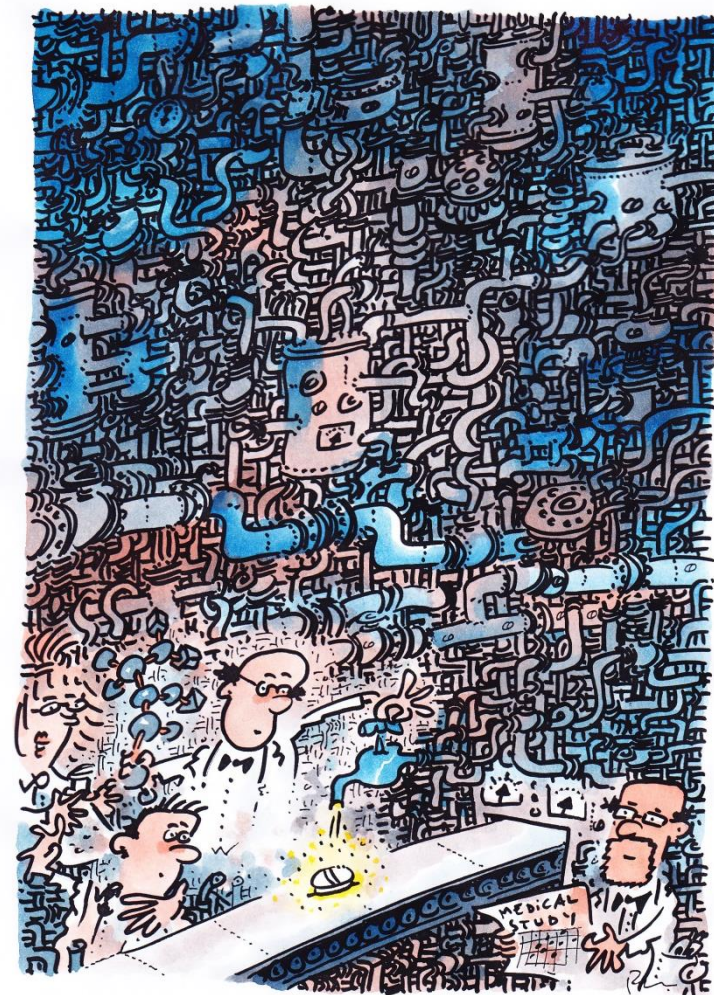
T = 0 : molécules totalement différentes

T = 1 : molécules identiques

	Diclofenac	Lumiracoxib	Erlotinib	Gefinitib
Diclofenac				
Lumiracoxib				
Erlotinib				
Gefinitib				

Quelles sont les paires de molécules les plus similaires?

Many thanks !



FONDS NATIONAL SUISSE
DE LA RECHERCHE SCIENTIFIQUE

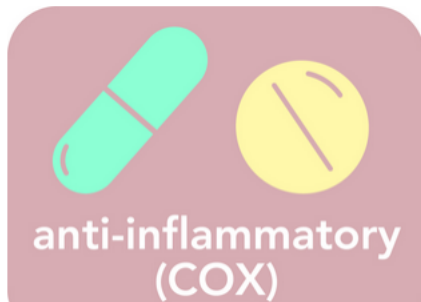


Swiss Institute of
Bioinformatics

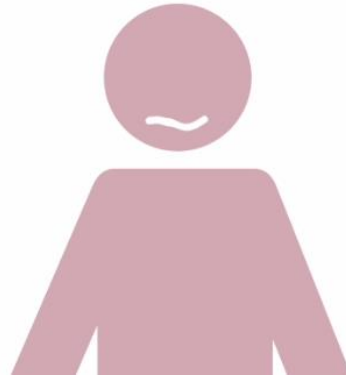
BRAF workshop



Have a try to design a drug...

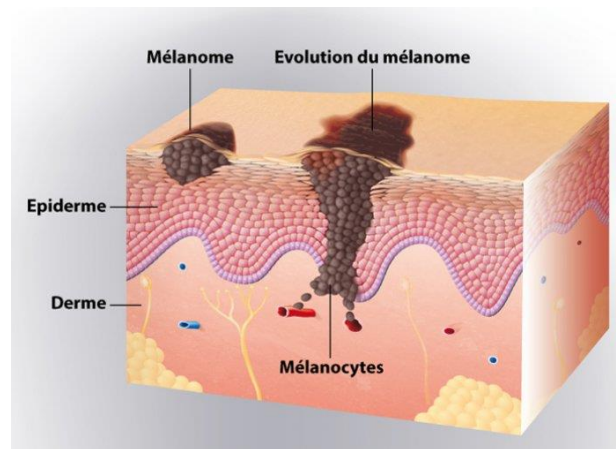


someone
falls ill...



- ➔ Protein's active site is **altered** (mutated)
- there is **too little** of a protein
- there is **too much** of a protein

- Melanoma is a skin cancer: it is the result of the abnormal proliferation of cells called ' melanocytes '.
- The tumor cells all derive from a cell ' initiator ' which has acquired certain characteristics enabling it to divide indefinitely (loss of cell division control).



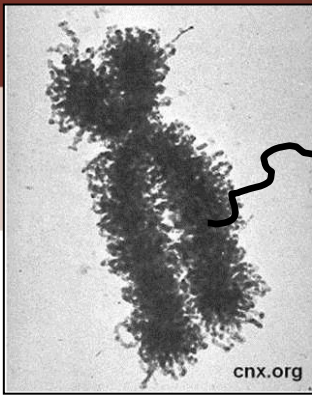
<http://ramsaygds.fr/nos-soins-nos-soins/m%C3%A9lanome>

Identify the protein involved in cancer (melanoma)
=
Identify the protein to be targeted



Approximately 40-60% of melanomas contain a mutation in the BRAF gene, which leads to the constitutive activation of downstream signaling in the MAP kinase pathway.

In 80-90% of these cases, the activating mutation consists in the substitution of glutamic acid for valine, at amino acid 600 (V600E).



```
TTTTAAAAACCATGAAAATCCATACATGCGTGTACACACATGCACATGCATGCGGACGCATACATACACA  
CACACACACACACACACACACACCTCCTTAAAAAAGAGTTACCTAAAAGGTGCAGAGAAAATTGGATGTAT  
ATTTAGGCCAGGGTGAAAACAAGATTTCTTTATGCAAATACCATATGAAAGTATAACCTGTGTAAGGGA  
GGGAGGTTGTCTCCTACTTTAAGGCTAGGAAAACTAAAAAGAGGTATTTTTGTAATAAACTAGGTTTATG  
CCTTTCCTCCAAATTCAAAATTAATATCTTTGATTAGCTTGTGCAGAGCAATAATTTTTCTCTAAAAA  
AATAAAAAAGCATCCTATCTTAAAAAGGAGCCAGAGTCAATGGAACCATGTGAATATTTGCCAAGGAAAC  
TTTAGACAAAACAAAATGTATGAGTCCAACTTTCACACGTCAATTTTTAAAGTGAAGTAAATATCT  
TTTGTAAATGAGCTCACAATGATTCATATACTACTCTACTTTTATGTATGTTAAAAATTTCCATAGTTG  
GCCAGACATGGTGGCTCATGCCTGTAATCCAGCATTTTGGGAGGCCAAGGCAGGCAGATCACCTGAGGT  
CTGGAGTTCAAGACCAGCCTGGCCAACATGGTGAACCCCATCTCTATTA AAAACACAAAATTAGCCAG  
GCATGGTGGCAGGCTCCTGTCTCCTGGCTACTAGGGAGGCTGAGGCAGGAGAATCACTTGAAGCAGGA  
GGCGGAGGTTGTAGTGAGCCAGACTGTGCCACTGCACTCCAGCCTGGGTGACAGAGTGAGAC  
CAAAAAATATATATATAAAAATTCATATAATTTATACTTTATATATAATGTATATAATTTAT  
ATAATTTATATACAATATATAACATATATATTATATATAACATATATATTATATATAACATAT  
ATATATAACATATATAATTTATATATATTATATATAAAAAGTTTCCATAGTAAAAAGTTT  
ACAGTTGTTCTAAAATTTAGGTGGTCATCAAAATTTGTTATATGTTTAAATCTTTGAGATAG  
TTGGTAGTTTGTTTACAGTGCAGACGATTATATGCCTTAAGTAAGCTTCATGATACAGTAACT  
ATAAACTGGCACAGAATATACATGCCAATATACAGATTTTGAATACAAATTTAAATFACATAGCTTTCTG  
ATTTTATAATTTAACTTAATGCCAAGTTCTTTTTTCTACTATTACATCAATTACATTTTTTTTTTTTT  
TTGAGACAGAGTCTCGCTCTGTGCGCCAGGCTGCAGTGCAGTGGCGTGATCTCAGCTCACTGCAAGCTCC  
ACCTCCGGGCTCAGCCATTCTCCTGCCTCAGCCTCCTGAGTAGCTGGGACTACAGGTGTCTGCCACCA  
CGCCTGGCTAATTTTGTTTTTTTTTTTAGTATTTTAGTAGAGACGGGGTTTCTCCTTGTAGCCAAGATGGT  
CTCGATCTCCTGACCTCATGATTCGCCCGCCTCAGCCTCCCAAAGTGCTAGGATTACAGGTGTGAGCCAT  
TTTTTTTTTTTTTTTTTTTGGAGACAGGGTCTTGCTCTGCCACCCAGGCTTGTGCAATGGTGGACCTAG  
AATCACTGCAAACTCCACTTCACAGGTTCAAGGGATTTCATGCCTCAGCTTCCAGAGCAGCTGGGATTA  
CAGGCATGTGCCAGCAAGCCCGGCTAATTTTTTTTGTATTGTTAGTAAAGACGGGGTTTTAGTATGTTCCCT  
CAGGCTGGTCTCGAACTCCTTACCTCAAGTGACCCGCTGCCTCAGCCTCCCAAAGTGCTGGGATTACAG  
GTGTGAGCCACTGCAACTGGCCTAATTACAATATTGTTTAAAGAAAAAAAATTTGTTATGATCTGCTTA
```

BRAF gene
A genetic variation
T -> A
found in ~60 % of the melanoma cells

<http://www.ncbi.nlm.nih.gov/nucore/56881591?report=fasta>

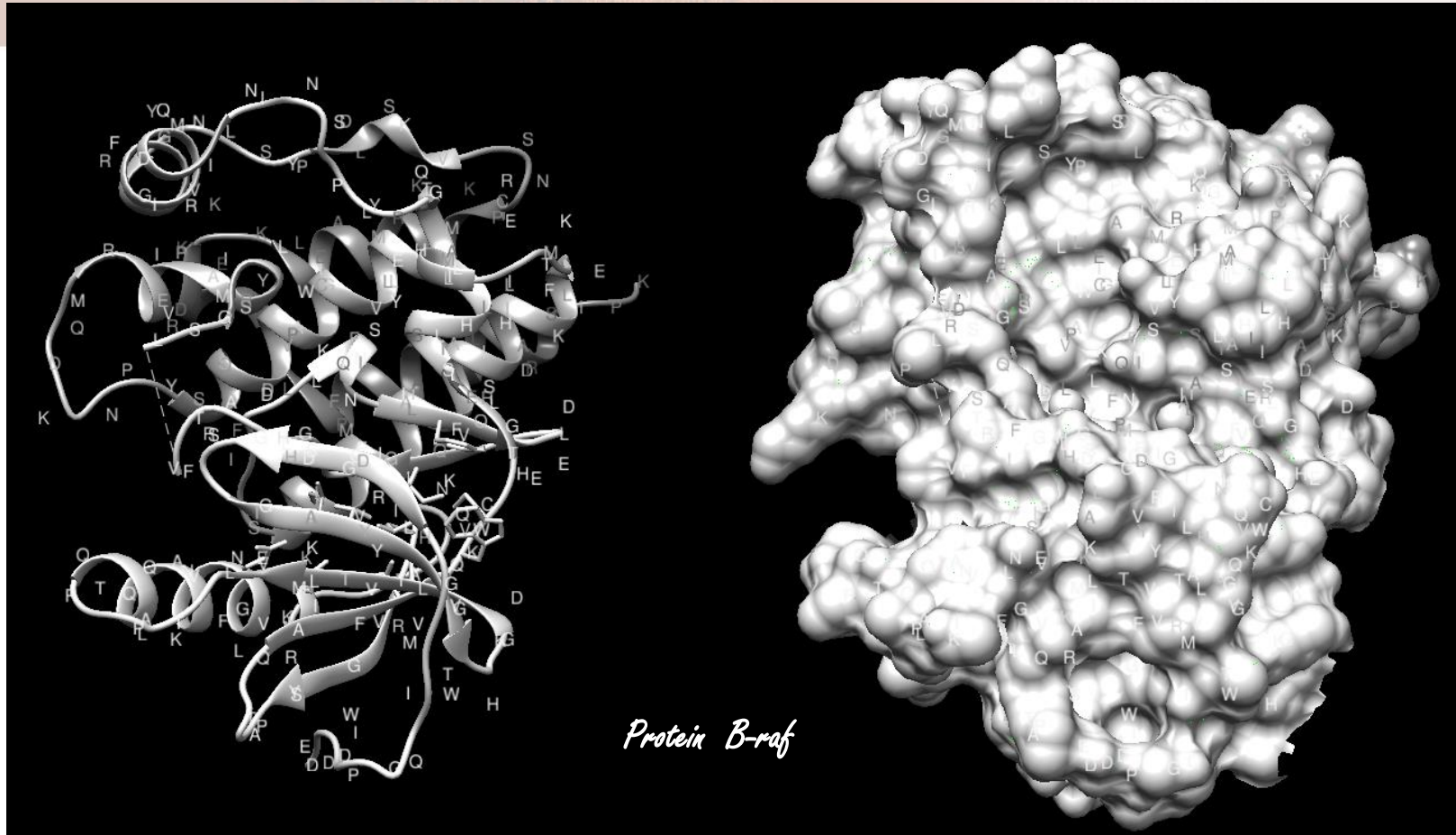
Bioinformatics

chromosome 7 DNA sequence

(GenBank database; 159'345'973 bp)



Swiss Institute of Bioinformatics



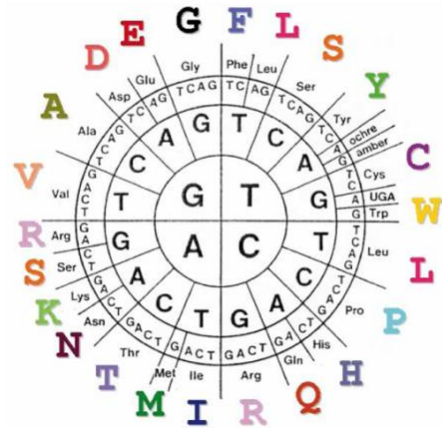
The protein produced by the BRAF gene is called B-raf

The B-raf protein is involved in cell division control

DNA
BRAF gene



...ggt gat ttt ggt cta gct aca gtg aaa tct cga tgg...



Genetic code

B-Raf
protein

... **G** **D** **F** **G** **L** **A** **T** **V** **K** **S** **R** **W** ...



One amino acid
There are 20 different amino acids



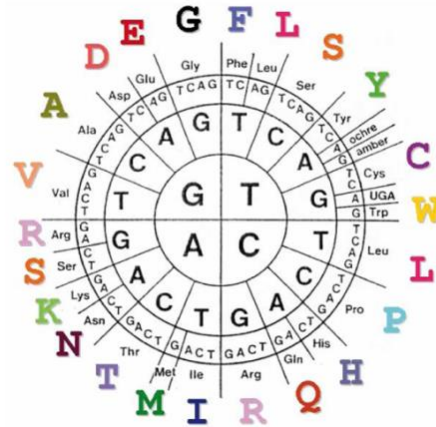
DNA
BRAF gene



Mutation

somatic
(in 40-60 % of the
melanoma cells)

...ggt gat ttt ggt cta gct aca gag aaa tct cga tgg...



Genetic code

B-Raf
protein

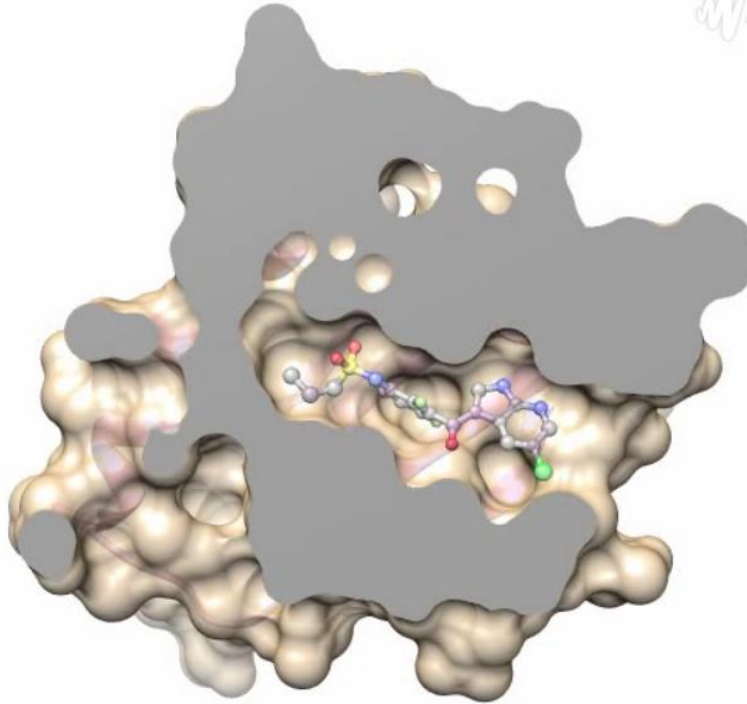
... **G** **D** **F** **G** **L** **A** **T** **E** **K** **S** **R** **W** ...

Mutation

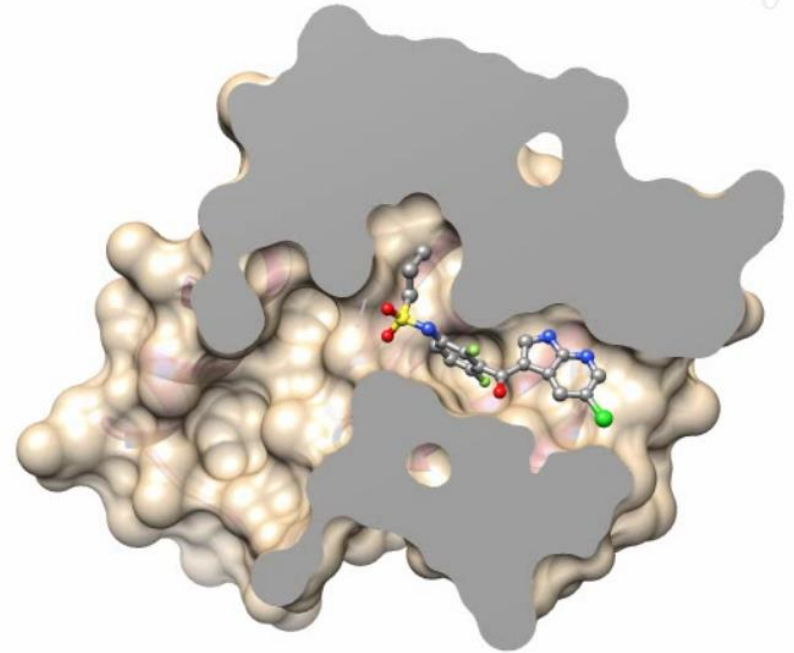


The mutation in the BRAF gene (V600E) leads to a change in the shape of B-Raf protein

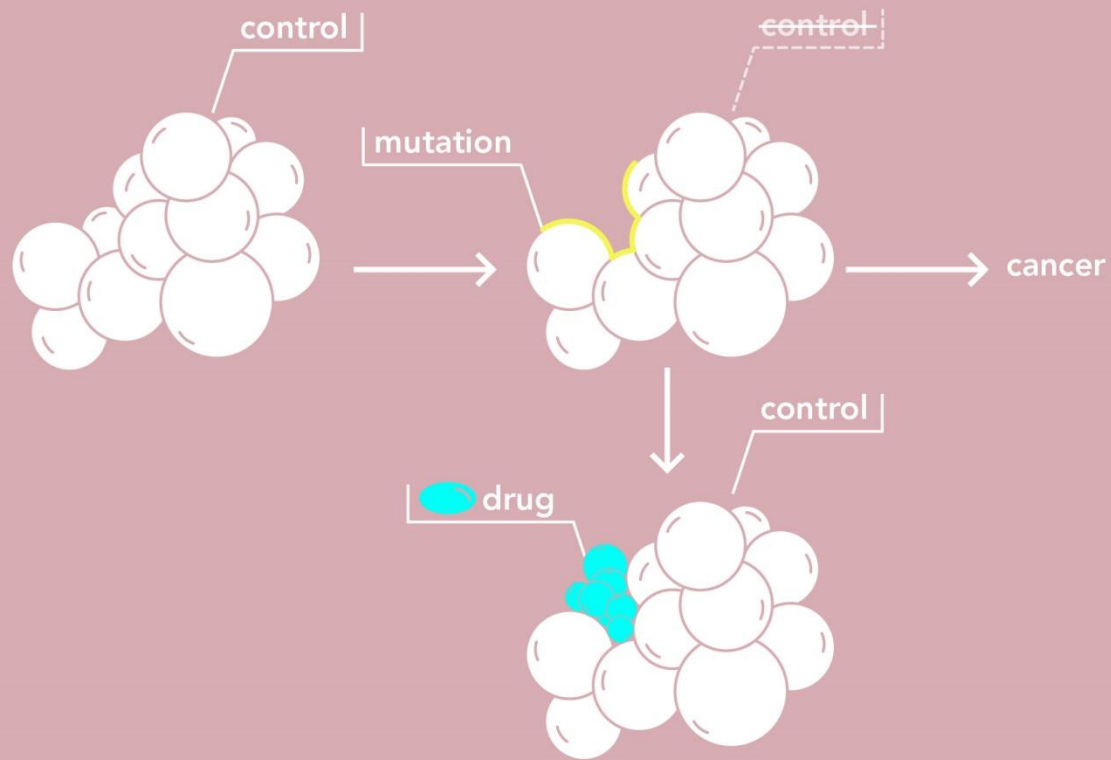
[Video](#): transition BRAF inactive -> BRAF active (V600E)



Control cell division



~~Control cell division~~



Design a drug that targets the mutated B-Raf protein, and which restores its 'control' function.

Designing a drug against skin cancer

This bioinformatics tool can predict how a drug-candidate molecule binds to a protein involved in skin cancer (mutated protein (BRAF V600E) and 'normal' protein (BRAF wt)).

Biological context: [here](#)

Drag and drop a drug-candidate over either BRAF V600E (active form) ou sur BRAF wt (inactive forme).

You can also design and test your own molecule: click on the « Design your own molecule » box.

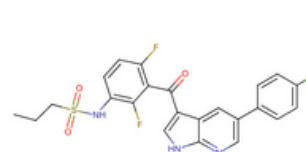
BRAF V600E (active form)



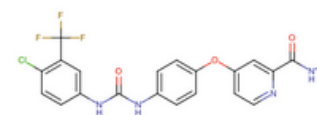
BRAF wt (inactive form)



Vemurafenib



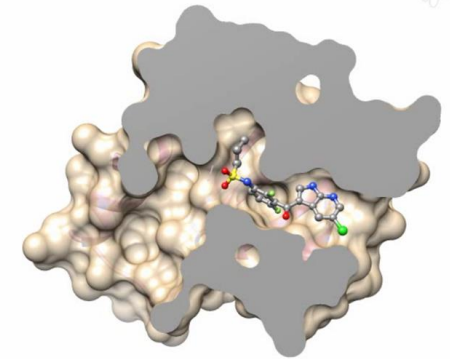
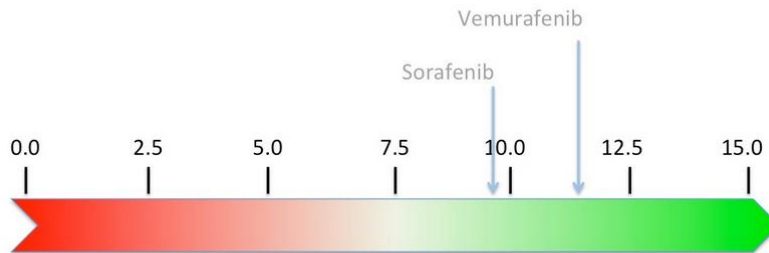
Sorafenib



Design
your own
molecule

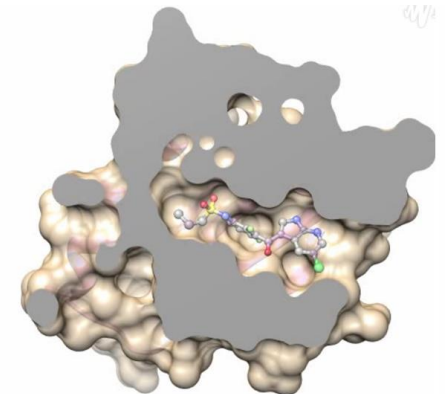
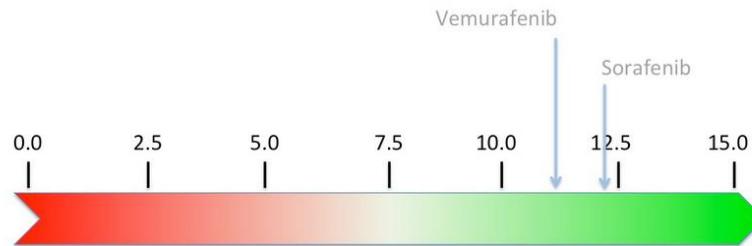
Vemurafenib is the most suitable drug for the treatment of melanoma with the BRAF V600E mutation: its docking score is higher compared to that of Sorafenib

BRAF V600E



BRAF V600E + Vemurafenib

BRAF wild type



BRAF + Vemurafenib

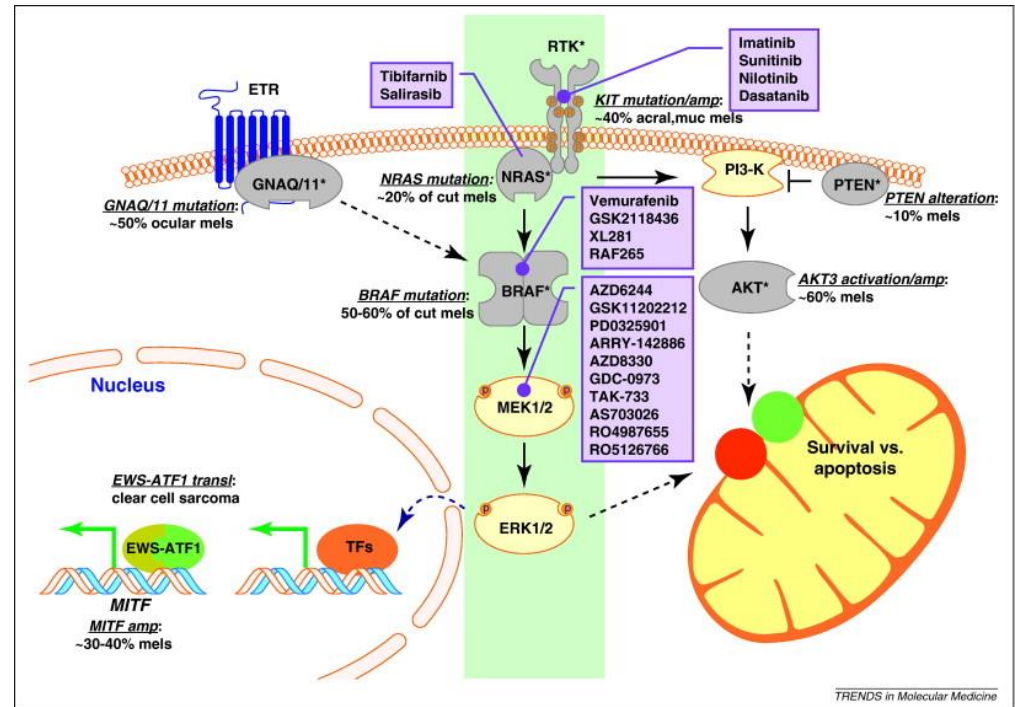
Find a molecule with a higher affinity for BRAF V600E compared to BRAF wild type...

- Inhibitors that are specific for the V600E B-raf mutant have been recently introduced for treating late-stage melanoma
- Vemurafenib (Zelboraf®) is an example of a specific inhibitor of V600E B-Raf
- Vemurafenib has been shown to dangerously favor tumor growth when the melanoma cells do not carry the B-Raf V600E mutation
- Doctor prescriptions are only allowed after having sequenced the BRAF gene of the patient cancer cells, using the FDA-approved cobas® 4800 BRAF V600 Mutation Test, to ascertain sequence alteration.

Summary of RAS pathway inhibitors

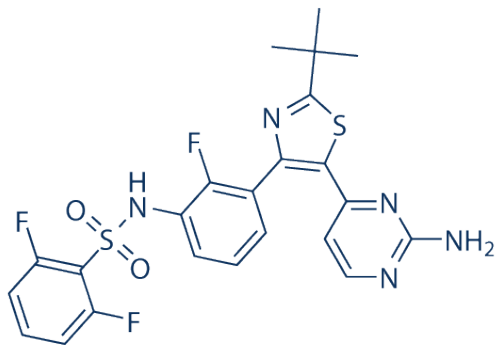
Drug	Targets	Stage of clinical development
Imatinib (Gleevec, STI571)	KIT, ABL, PDGFR, NQO2 [84, V-ATPase [85]	Approved for CML and GIST [86]
Sunitinib (SU11248)	KIT, PDGFR, VEGFR [87]	Approved for RCC and GIST [87]
Nilotinib	KIT, ABL, LCK, NQO2, DDR1 [84]	Approved for CML [88]
Dasatanib (BMS-354825)	KIT, ABL, SRC [89, DDR1, BTK, TEC [84]	Approved for CML [90]
Tipifarnib (R115777)	RAS and other proteins that require farnesyl transferase [91]	Phase II/III [91]
Salirasib (FTS)	RAS, mTOR [92]	Phase II [43]
Sorafenib (BAY 43-9006)	BRAF	Approved for RCC and HCC Failed at phase II for advanced melanoma [52]
PLX4720	BRAF, CRAF, VEGF, PDGF, FLT3, KIT [46]	Precursor of PLX4032
Vemurafenib (PLX4032)	BRAF ^{V600E} , BRAF ^{WT} , BRK [56]	Phase III [61]
GSK2118436	BRAF ^{V600E} , CRAF, BRAF ^{WT} , ARAF, ACK1, SRMS and MAP4K5 [57, 58]	Phase I/II [68]
PD0325901	MEK	Phase II [75]
AZD6244 (ARRY-142886)	MEK	Phase II [93]
Anthrax lethal toxin	MEK	
GSK1120212 (JTP-74057)	MEK	Phase III

Pathway involved in the control of cell division

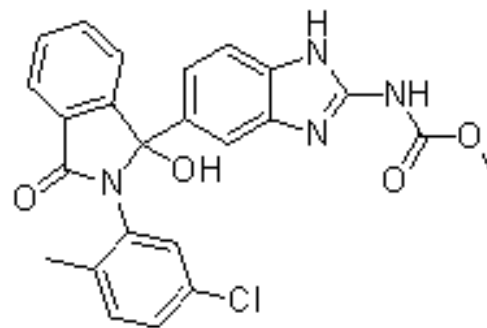


Molecules targeting BRAF

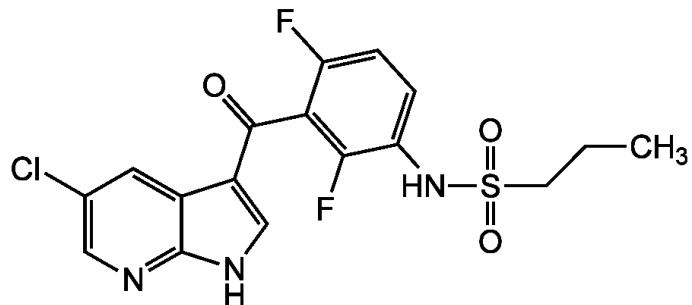
- Dabrafenib (GSK2118436)



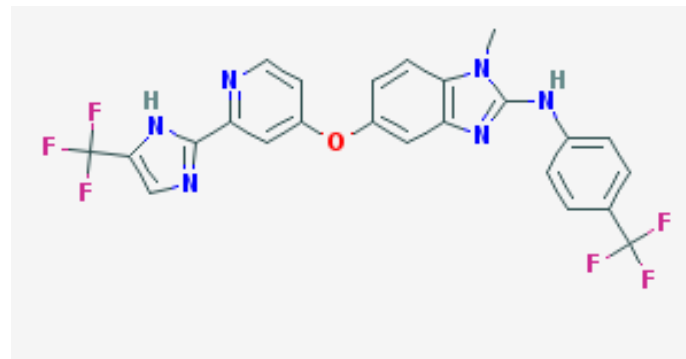
XL281



- PLX4720



RAF265



Septembre 2015

Médecine personnalisée, la révolution

> Santé Un programme a été lancé en juin aux Etats-Unis pour faire progresser les thérapies ciblées sur le profil génétique

> Les grandes pharmaceutiques, en particulier Roche et Novartis, sont à la pointe

Willy Boder

Début juillet a commencé, dans 2400 hôpitaux américains, une vaste opération de dépistage de patients atteints d'une forme ou d'une autre de cancer.

Contrairement aux études cliniques traditionnelles, l'objectif n'est pas de recruter des malades souffrant d'un même type de cancer, du sein, des poumons, ou de la prostate par exemple, pour tester l'efficacité d'un seul nouveau médicament. Il s'agit, au contraire, de rassembler les patients selon le profil génétique de leur tumeur, toutes catégories confondues.

Les médecins administreront une vingtaine de médicaments, dont certains proviennent de groupes pharmaceutiques suisses, qui sont déjà sur le marché ou encore en développement. Une patiente souffrant d'un cancer du sein avancé recevra par exemple une thérapie normalement destinée à un patient souffrant d'un cancer du poulmon.

Cette nouvelle approche des programmes d'essais cliniques via le profil génétique des tumeurs et des patients, désignée par le terme «essais en corbeille» est suivie d'un œil bienveillant par la Food and Drug Administration (FDA), chargée du contrôle des médicaments aux Etats-Unis. Cette vaste étude s'intègre dans la tendance scientifique générale suivie actuellement par tous les grands groupes pharmaceutiques, à savoir rendre chaque médicament plus efficace en le modulant selon le profil génétique de la maladie dont souffre exactement tel ou tel patient.

La méthode d'essais cliniques en «corbeilles», menée aux Etats-Unis sous le contrôle de l'Institut national du cancer (NCI), vise à

élargir et à affiner ce qu'on appelle la médecine personnalisée, ou la médecine de précision, selon le terme utilisé par Barack Obama. Le président des Etats-Unis est persuadé de pouvoir faire progresser rapidement la recherche scientifique de cette manière et tente d'obtenir un financement par le Congrès de ces nouvelles formes de thérapie.

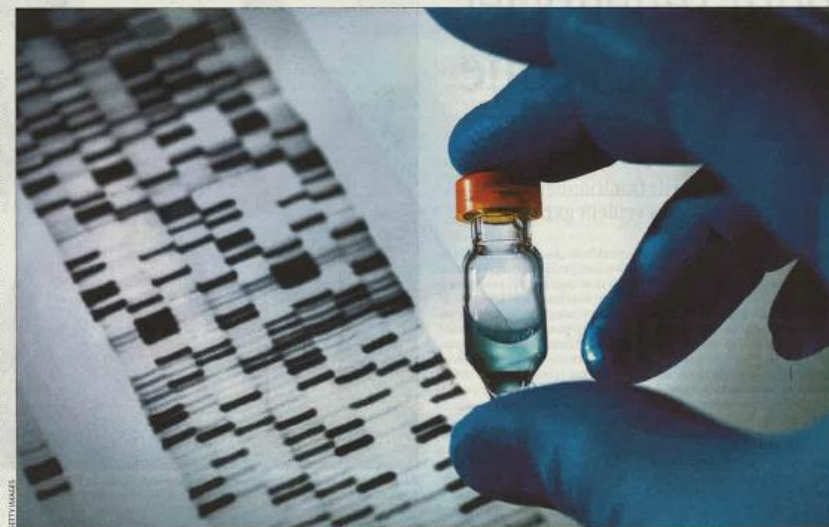
Joe Jimenez, patron de Novartis, deuxième entreprise au monde, derrière Roche, dans la mise à disposition de médicaments contre le cancer, estime qu'un quart des médicaments sont actuellement gaspillés de différentes manières. L'une des principales causes de ce gaspillage, qui coûte très cher aux systèmes de santé, provient du manque de connaissances scientifiques précises sur le profil génétique de telle ou telle maladie à mettre en corrélation avec l'ADN du patient. Le médecin est dès lors contraint de tester plusieurs médicaments sur un patient avant de trouver celui qui est le plus efficace.

Cette approche empirique se produit pour de très nombreuses maladies, de l'hypertension aux maladies infectieuses, en passant par des affections très graves. Pour les maladies où le pronostic vital est engagé, comme certaines formes de cancer, ce tâtonnement, synonyme de perte de temps, peut conduire à la mort.

Selon les spécialistes, la médecine de précision a aussi pour avantage de réduire les coûts de la santé. Les médicaments de ce type associés à un diagnostic (biomarqueur ou test spécifique d'ADN accompagnant le traitement) sont, certes, nettement plus chers que les produits thérapeutiques traditionnels, mais ils évitent le tâtonnement médical et la facturation aux caisses maladie de médicaments inefficaces.

Rassembler les patients selon le profil génétique de leur tumeur, toutes catégories confondues

Le programme du NCI qui touche 2400 hôpitaux et 1000 patients sélectionnés au sein d'un groupe de 3000 malades du cancer, est doté d'un budget de 30 à 40 millions de dollars. Le critère de succès de la thérapie sera principalement basé sur une réduction rapide de la tumeur d'au moins un tiers.



La médecine personnalisée combine profil génétique et médicaments thérapeutiques de manière ciblée. ARCA/VEIS

Depuis le premier séquençage d'un génome humain, en 2003, l'analyse des maladies, en particulier le cancer, repose de manière de plus en plus précise sur la découverte de mutations génétiques et l'activation ou la désactivation de protéines, au sein même ou à la surface des cellules. Ces mécanismes provoquent la prolifération des cellules cancéreuses dans l'organe touché, puis sous forme de métastases.

Les cancers ne sont désormais plus considérés comme différentes formes d'une même maladie, mais comme une multitude de maladies ayant des caractéristiques et un profil génétique propre. Le cancer évolue différemment selon chaque patient, ce qui entraîne, si le mécanisme génétique qui dysfonctionne peut être ciblé et corrigé, la prescription d'un médicament spécifique et une approche thérapeutique personnalisée.

«Grâce à la médecine personnalisée nous obtenons immédiatement des taux de réponse inédits aux traitements. Il y a vraiment un changement de paradigme dans ce domaine scientifique, s'enthousiasme Dietmar Berger, res-

Comment ça marche

Le profil génétique du patient et de sa tumeur détermine le traitement à suivre



La majorité des thérapies contre le cancer à l'étude sont associées à un ou plusieurs tests génétiques développés en parallèle avec l'élaboration finale de la substance active contenue dans le médicament. Le taux d'efficacité de la thérapie, ainsi adaptée au profil précis du patient et de sa tumeur, peut dépasser 70% et augmente fortement ses chances de survie à la suite d'un cancer métastaté.

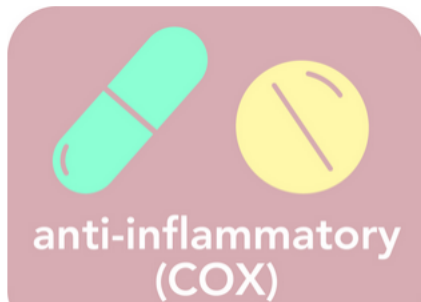
ponsable du développement de Roche en oncologie. Il cite le cas du médicament Alectinib, contre le cancer du poulmon au stade avancé, en phase d'homologation. Les métastases dans le cerveau se réduisent rapidement avec un taux de réponse jusqu'à 70% d'une durée jusqu'à onze mois.

Roche place aussi beaucoup d'espoir dans Atezolizumab, un médicament, associé à la présence de la protéine PD-1, qui fait appel à la stimulation du système immunitaire pour détruire les cellules cancéreuses. Ce mécanisme, identique chez certains patients spécialement diagnostiqués, peut être appliqué dans la lutte contre les cancers du poulmon, de la prostate, du sein et du rein. «70% de nos médicaments en phase clinique II et III en oncologie ont désormais un test diagnostic spé-

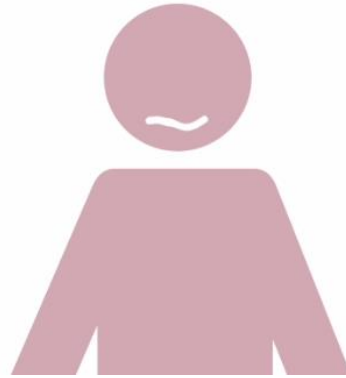
cifique associé», constate Dietmar Berger. «On assiste réellement à une révolution dans le traitement de ces maladies, confirme Severin Schwam, patron de Roche. Auparavant, un cancer métastaté menait le plus souvent à la mort. Aujourd'hui, dans de nombreux cas, grâce à la médecine personnalisée, on peut prolonger la vie durant des années, et peut-être guérir de ce type de cancer.»

IDO1 workshop

Have a try to design a drug...



someone
falls ill...

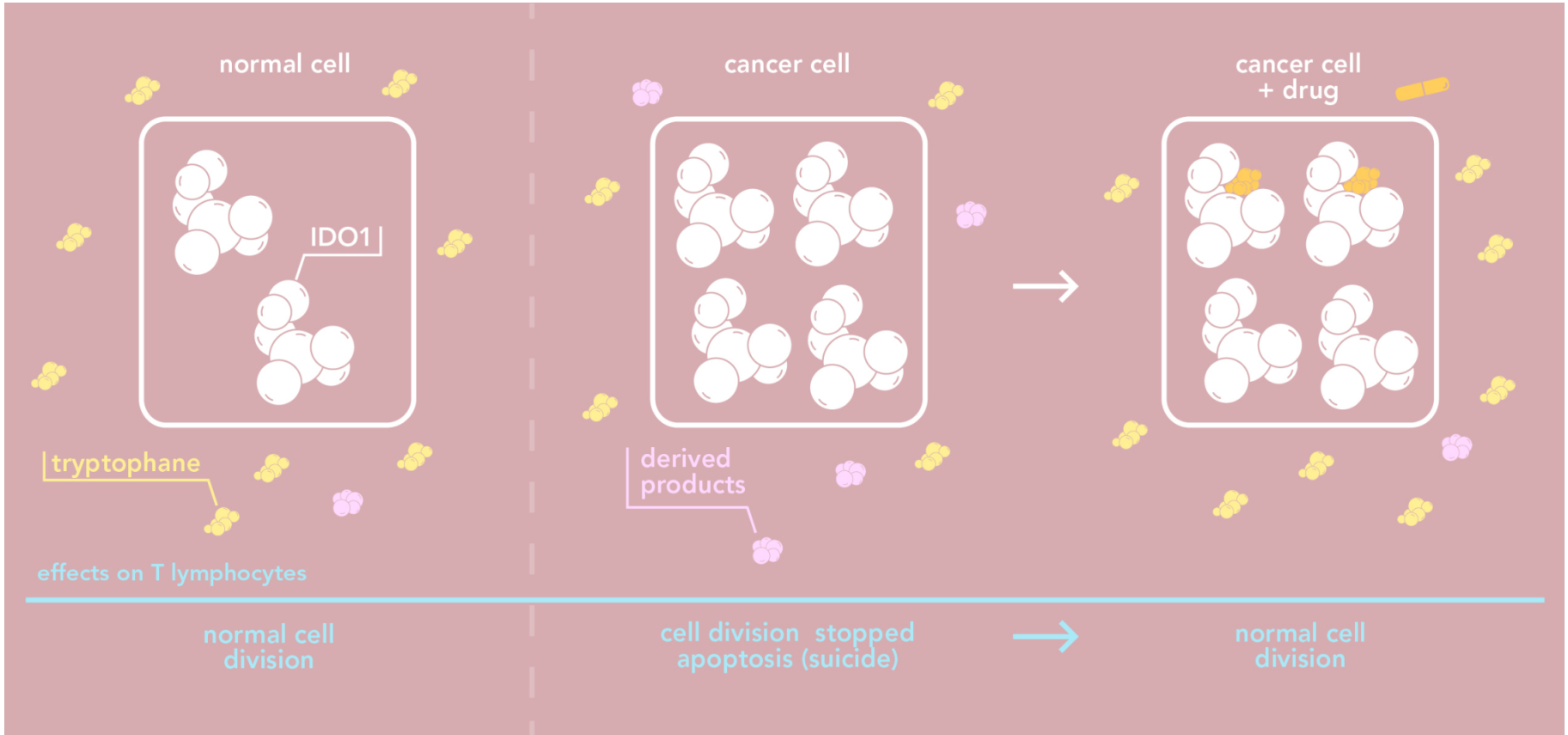


- Protein's active site is **altered** (mutated)
- there is **too little** of a protein
- there is **too much** of a protein

The immune system plays a key role in fighting off cancer by tracking down and eliminating cancer [cells](#).

Cancer cells, however, also have ways of evading the immune system:

- Many cancer cells produce a protein known as indoleamine 2,3-dioxygenase 2 (IDO1) in large quantities.
- IDO1 degrades tryptophane, which is an essential [amino acid](#) and has to be present in sufficient quantities for cells to divide normally. A high concentration of IDO1 in the environment of a cancer cell decreases the amount of tryptophane, which in turn stops immune cells, or T lymphocytes, from proliferating. Furthermore, certain side products which result from tryptophane degradation are toxic for T lymphocytes.
- IDO1 is a promising therapeutic target in anti-cancer treatment: inhibiting IDO1 increases the effectiveness of immunotherapies as well as other treatments by restoring the immune response.



How do you design an anti-cancer drug?

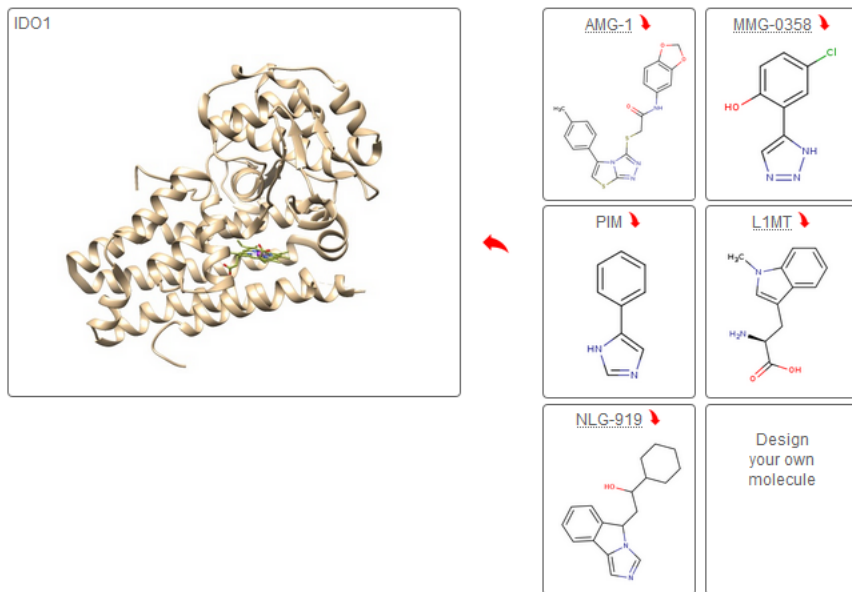
This bioinformatics tool can predict how a drug-candidate molecule binds to a protein that is produced in large quantities (IDO1) by cancer cells to help them escape from the immune system.

Biological context: [here](#).

Drag and drop a drug-candidate on the IDO1 protein.

Description of drug-candidate molecules [here](#).

You can also design and test your own molecule: click on the « Design your own molecule » box.



www.drug-design-workshop.ch/ido1.php

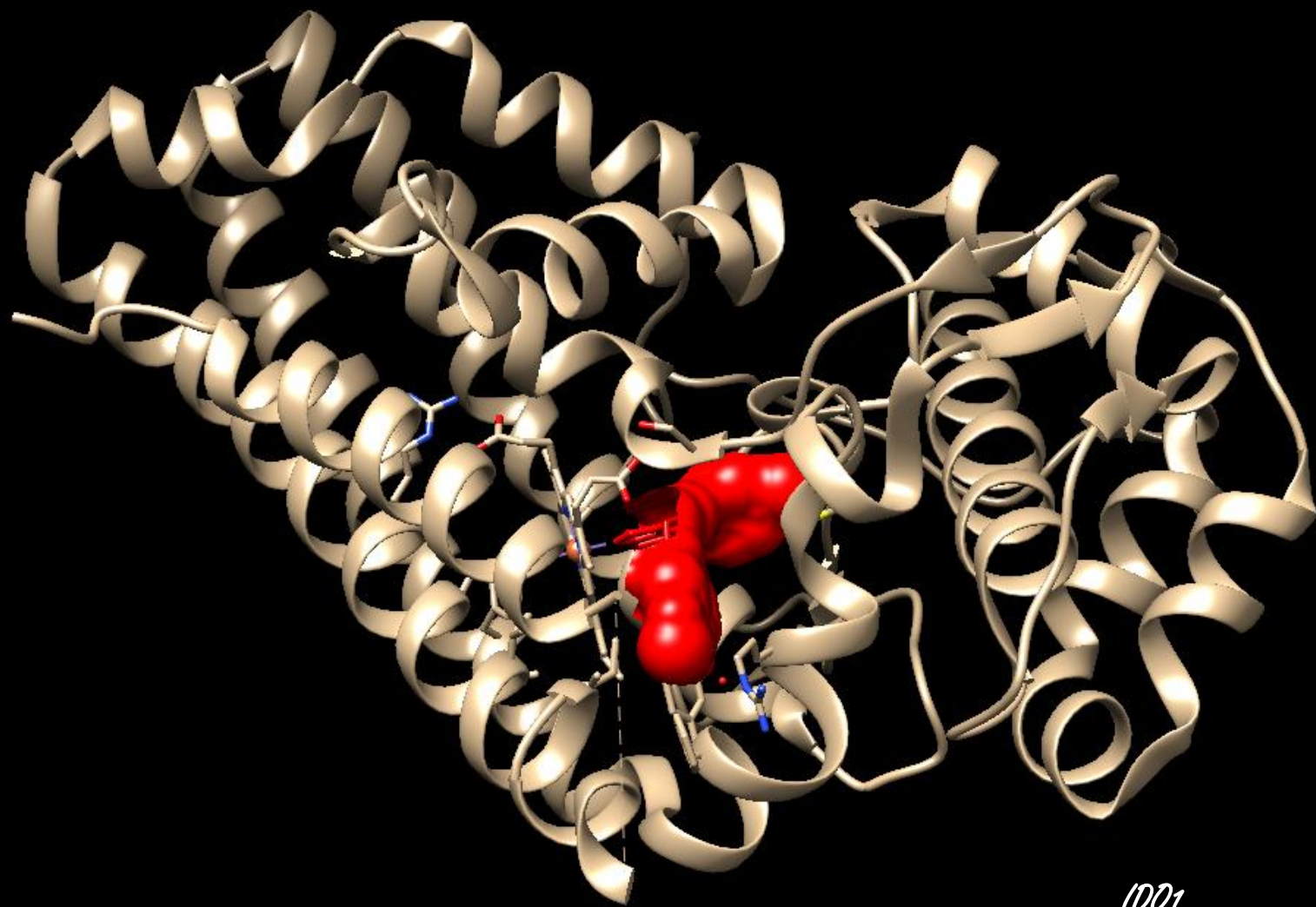
AMG-1, an imidazothiazole developed by Dainippon Sunimoto Pharma.

MMG-0358, a triazole designed by the SIB Swiss Institute of Bioinformatics. MMG-0358 has a strong affinity for IDO1 and is active *in vivo*.

PIM, an imidazole. PIM is one of the first inhibitors whose 3D structure complexed with IDO1 has been characterized. PIM has a weak affinity for IDO1 and is not very specific.

L1MT, or L-1-methyltryptophane, an inert analog of tryptophane that inhibits IDO1. L1MT is undergoing clinical tests for the treatment of breast and prostate cancer.

NLG-919, an imidazole developed by NewLink Genetics. NLG-919 is under clinical evaluation to treat solid tumors.



1001

Additional links

- www.drug-design-workshop.ch (EN, FR)
<http://www.atelier-drug-design.ch/CADD-FormationContinuee.pdf> (EN)
http://education.expasy.org/bioinformatique/DrugDesign_complement.html (FR)
- www.chromosomewalk.ch (DE, EN, FR): discover the world of DNA, genes, proteins, common genetic variations and bioinformatics tools which are used to visualize genomic data.
- Atelier de Bioinformatique (FR): <http://education.expasy.org/bioinformatique/> a selection of additional bioinformatics activities such as 'Phylogeny and Biodiversity' and 'BLAST discovery'
- [Protein Spotlight](#) (EN): small articles about a specific protein - or family of proteins – written on an informal tone.
- www.sib.swiss/bioinformatics-for-all/workshops: online bioinformatics-related workshops for different levels of understanding