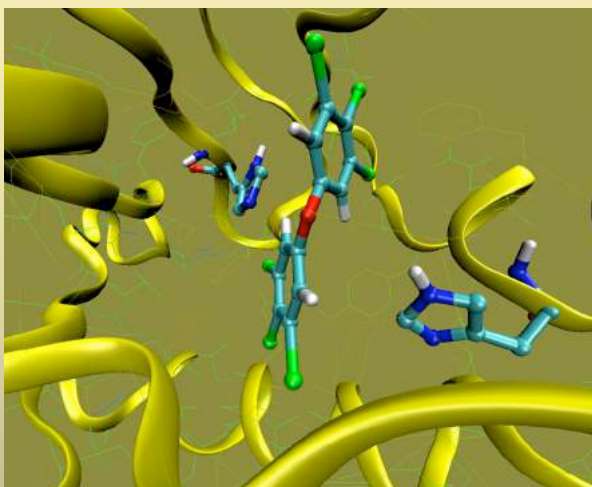
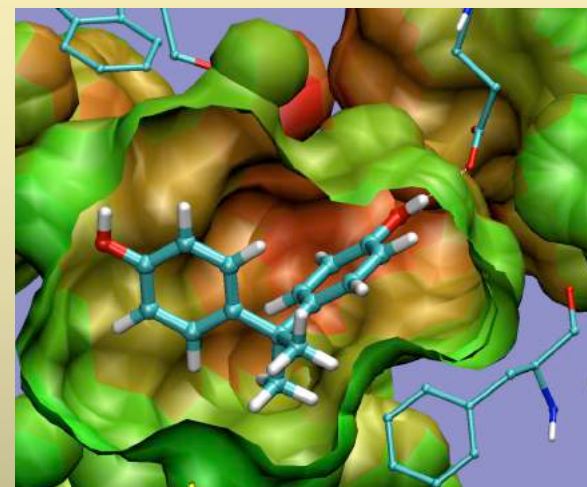


# zh aw — 3. Wädenswiler Chemie-Tag 16. Juni 2011

VirtualToxLab™ — In silico prediction of the toxic potential of drugs and chemicals



[www.nrp50.ch](http://www.nrp50.ch)



[www.sfu.ca](http://www.sfu.ca)

- Modeling toxic phenomena
- Mixed-model QSAR
- The 16 virtual test kits
- The *VirtualToxLab* concept
- Examples: Toxic potentials and their mechanistic interpretation
- Applications of the *VirtualToxLab*

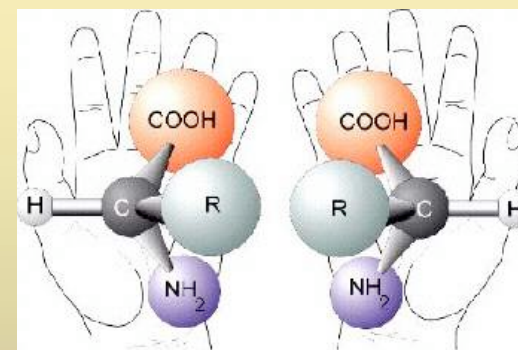
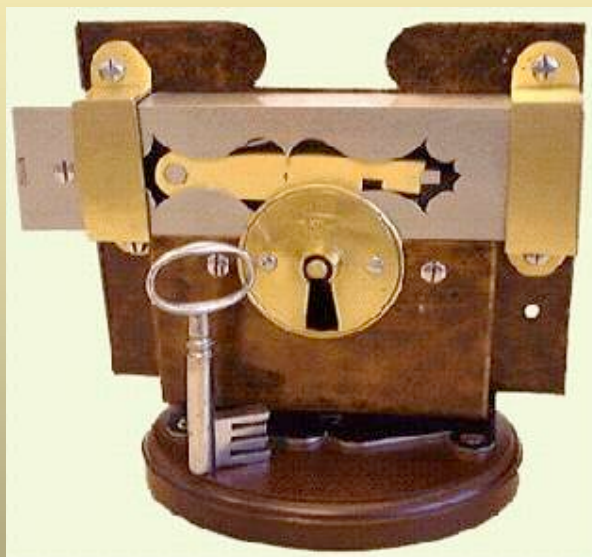


[www.treehugger.com](http://www.treehugger.com)



Emil Fischer (1838–1914)

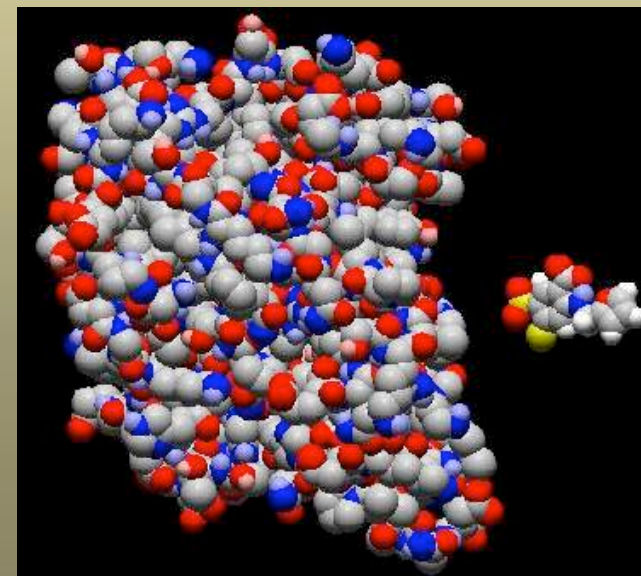
**Emil Fischer (1894): Lock-and-Key Analogon**



3D complementarity leads to molecular recognition

„Um ein Bild zu gebrauchen, will ich sagen, dass Enzym und Glykosid zu einander passen müssen, wie Schloss und Schlüssel, um eine chemische Wirkung aufeinander ausüben zu können.“

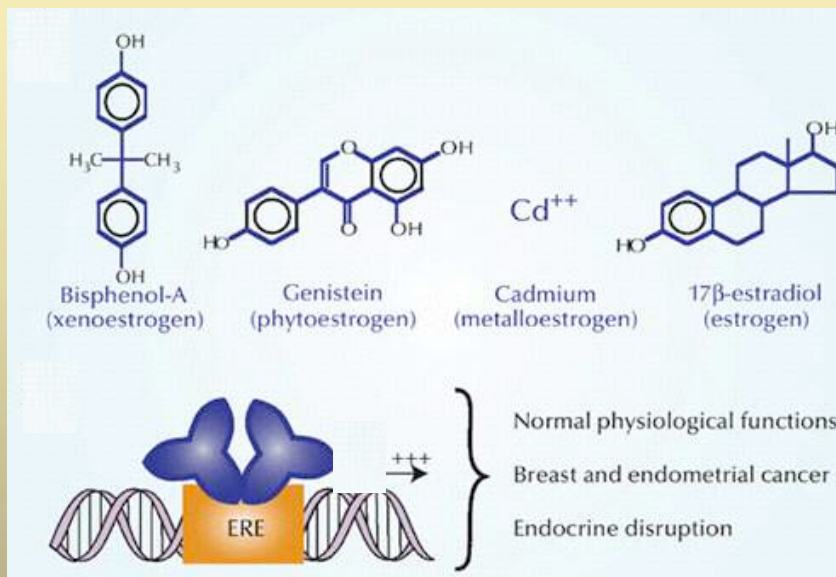
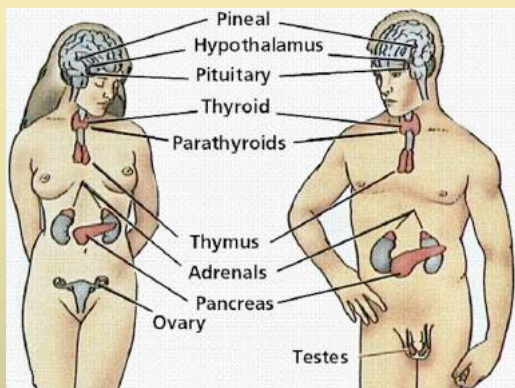
Emil Fischer (Nobel Laureate, 1902)



# zh aw — 3. Wädenswiler Chemie-Tag 16. Juni 2011

VirtualToxLab™ — In silico prediction of the toxic potential of drugs and chemicals

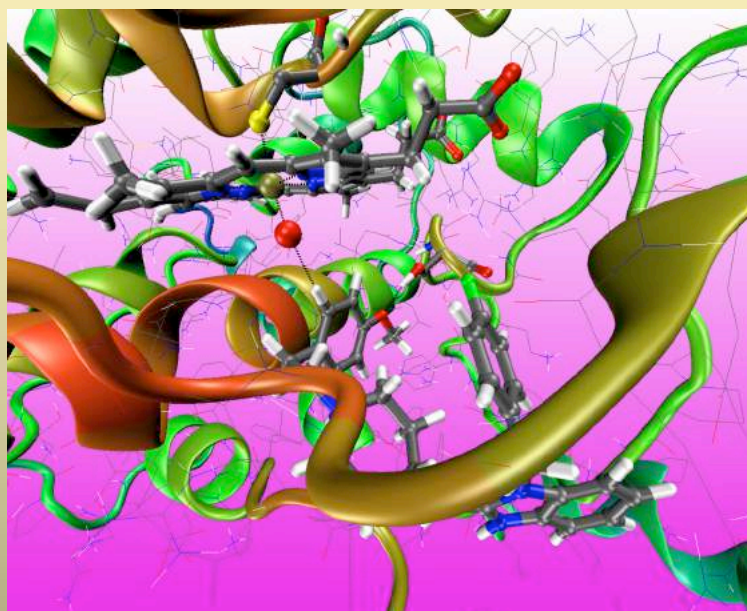
## Endocrine disruptors



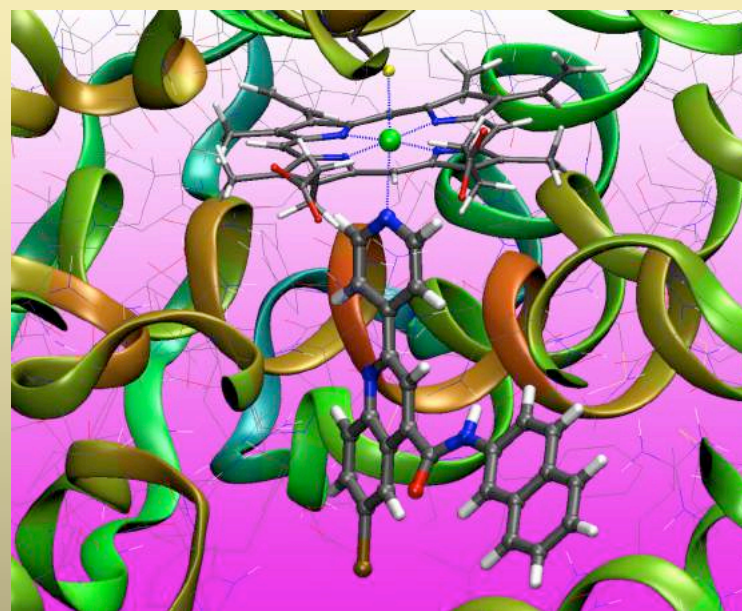
Endocrine disruptors — sometimes also referred to as hormonally active agents — are exogenous substances that act like hormones in the endocrine system and disrupt the physiological function of endogenous hormones. Studies have linked endocrine disruptors to adverse biological effects in animals, giving rise to concerns that low-level exposure might cause similar effects in humans.



### Metabolic disruptors

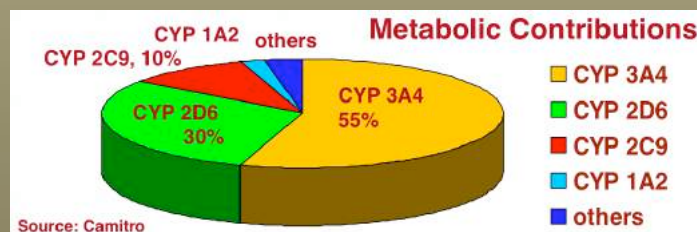


Compound acts as a substrate to CYP 3A4

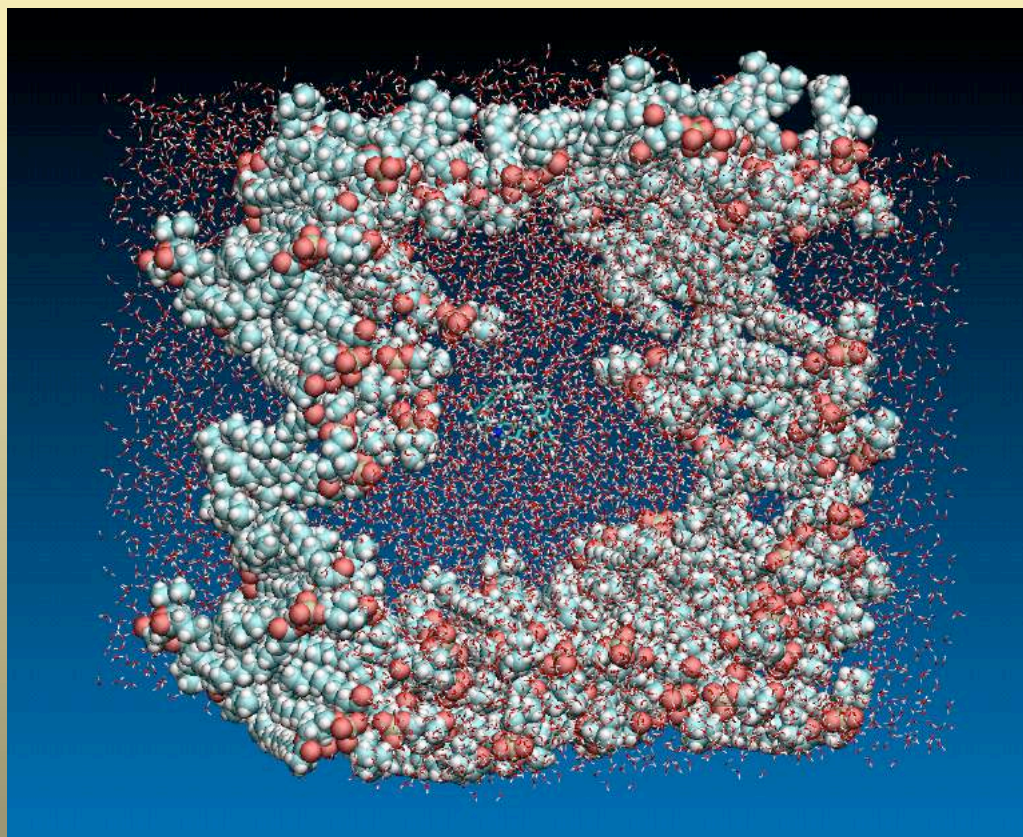


Compound acts as an inhibitor to CYP 2C9

Metabolic disruption refers to the interaction with metabolizing macromolecules — most prominently, enzymes from the cytochrome P450 family, for example CYP 1A2, CYP 2C9, CYP 2D6 and CYP 3A4.

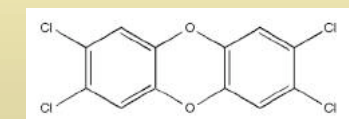


### Interference with the hERG K<sup>+</sup> channel



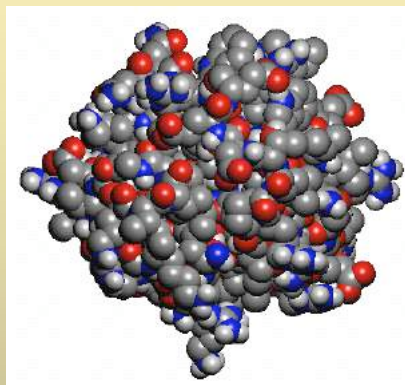
- **hERG** (human Ether-à-go-go Related Gene)
- Involved in cardiac action potential repolarization
- Drugs/chemicals blocking the channel can trigger a fatal disorder called **long QT syndrome**
- A number of clinically successful drugs inhibit hERG and trigger unwanted side effects
- Nowadays hERG is an **antitarget** which must be avoided during drug development

### Computer simulations of receptor-mediated toxic phenomena



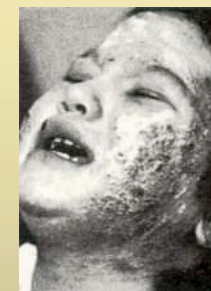
Contamination/intoxication

Cascade of events I  
Biotransformation



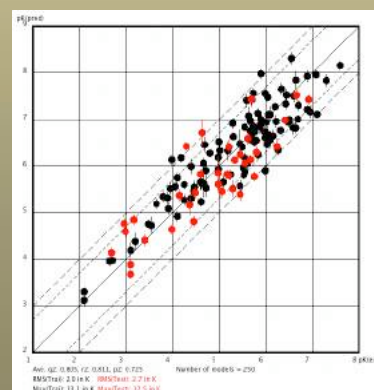
Cascade of events II  
Signal transduction

www.brooklyn.cuny.edu

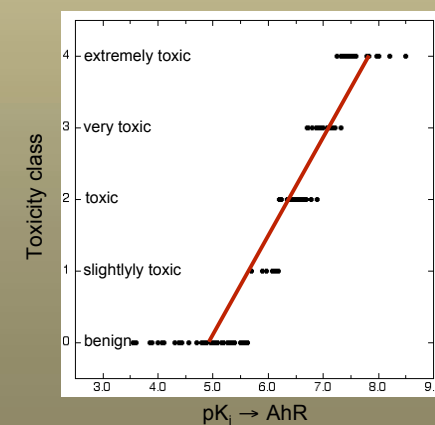


Observed effect

Simulated binding to the target protein

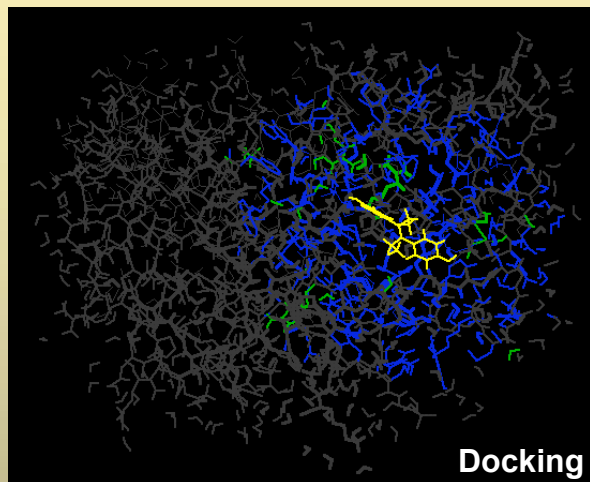


→



**Consequence:** quantifying the binding affinity to a protein triggering adverse effects may predict the toxic potential but not toxicity.

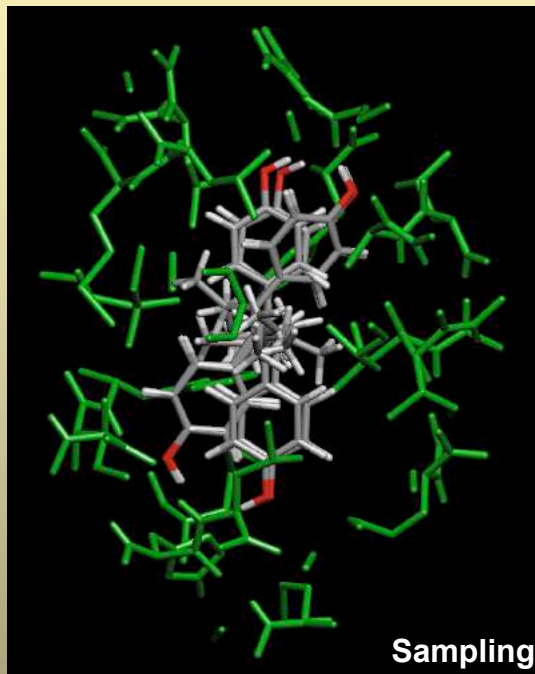
**Mixed-model approach: automated, flexible docking + mQSAR**



**Docking**

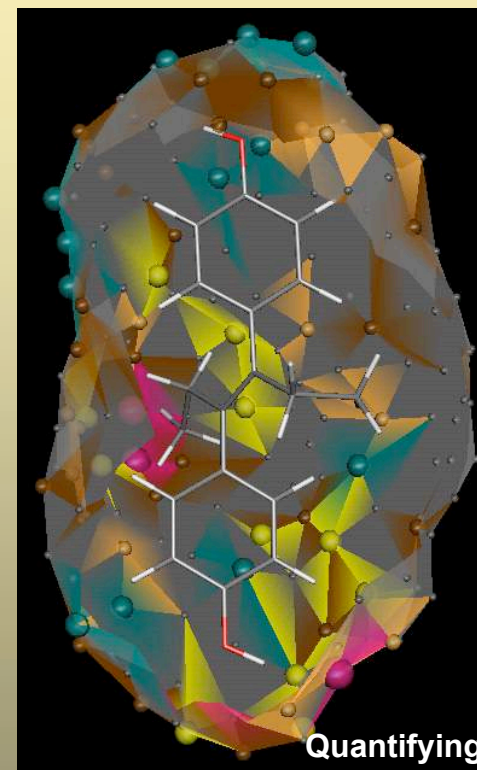
Automated, flexible docking (software Yeti)

*J. Med. Chem.* **2005**, *48*, 3700–3703  
*ChemMedChem* **2006**, *1*, 73–81  
*ChemMedChem* **2007**, *2*, 78–87  
*Toxicol. Lett.* **2007**, *173*, 17–23  
*ChemMedChem* **2009**, *4*, 100–109  
*Toxicol. Lett.* **2009**, *189*, 219–224  
*ATLA* **2009**, *37*, 477–496  
*Mol. Inf.* **2010**, *1*, 27–36



**Sampling**

Sampling low-energy poses → 4D data set



**Quantifying**

Quantifying the binding affinity using mQSAR (software Quasar, Raptor)

**Automated, flexible docking using a directional force field**

$$E_{\text{total}} = \sum_{\text{bonds}} K_r (r - r_{\text{eq}})^2 + \sum_{\text{angles}} K_\theta (\theta - \theta_{\text{eq}})^2 +$$

$$\sum_{\text{dihedrals}} \frac{V_n}{2} [1 + \cos(n\phi - \gamma)] + \sum_{\text{nb pairs}} \frac{q_i \cdot q_j}{4\pi\epsilon_0 D(r) r_{ij}} + \sum_{\text{nb pairs}} \frac{A}{r_{ij}^{12}} - \frac{B}{r_{ij}^6}$$

$$+ \sum_{\text{H-bonds}} \left( \frac{C}{r_{\text{H-Acc}}^{12}} - \frac{D}{r_{\text{H-Acc}}^{10}} \right) \cdot \cos^2(\theta_{\text{Don-H-Acc}}) \cdot \cos^n(\omega_{\text{H-Lig-LP}})$$

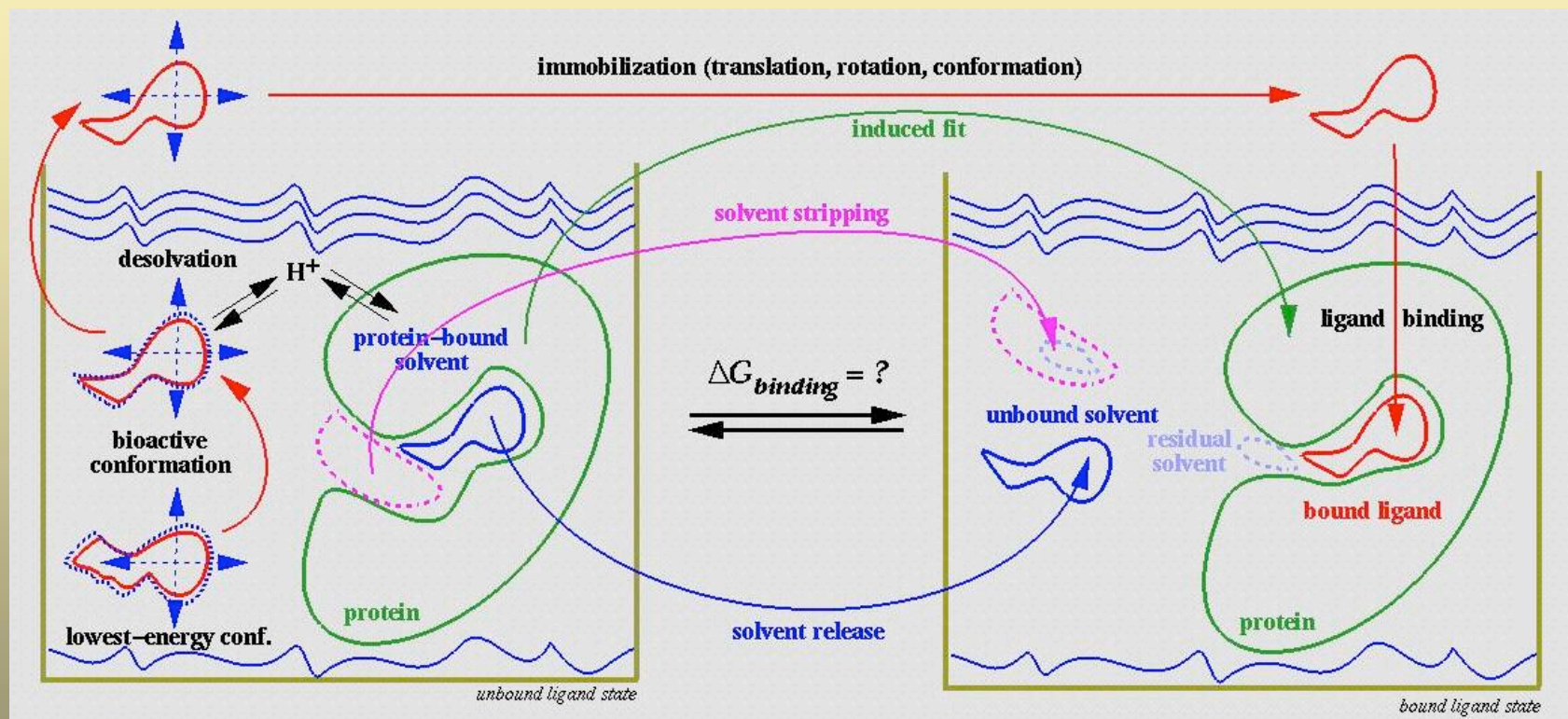
$$+ \sum_{\text{metal-ligand pairs}} \frac{q_i^{\text{Cl}} \cdot q_j^{\text{Cl}}}{4\pi\epsilon_0 D(r) r_{ij}} + \sum_{\text{metal-ligand pairs}} \left( \frac{E}{r_{\text{M-Lig}}^{12}} - \frac{F}{r_{\text{M-Lig}}^{10}} \right)$$

$$+ (E_{\text{MC}} + E_{\text{LFS}}) \cdot \prod_{\text{indep. angles}} \cos^2(\psi_{\text{Lig-M-Lig}} - \psi_{\text{eq}}) \cdot \frac{1}{n} \sum_{\text{1st shell ligands}} \cos^n(\omega_{\text{M-Lig-LP}})$$

*J. Am. Chem. Soc.* **1990**, *112*, 4759–4767



## Quantifying ligand–protein interactions



$$\Delta G_{\text{binding}} \propto E_{\text{ligand-protein}} - E_{\text{ligand desolvation}} - E_{\text{ligand internal strain}} - T\Delta S - E_{\text{induced fit}}$$

*J. Med. Chem.* **2000**, 46, 4416–4427

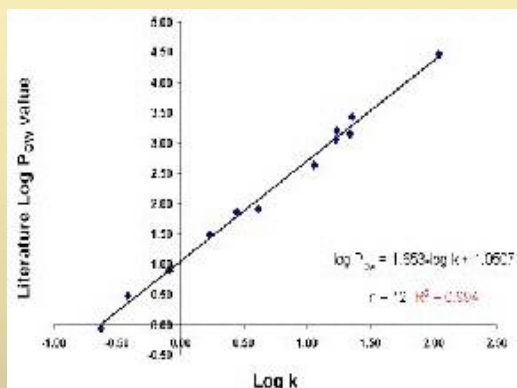
*J. Med. Chem.* **2002**, 45, 2139–2149

*J. Med. Chem.* **2005**, 48, 3700–3703

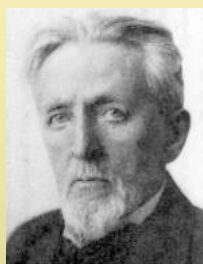
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1D-QSAR

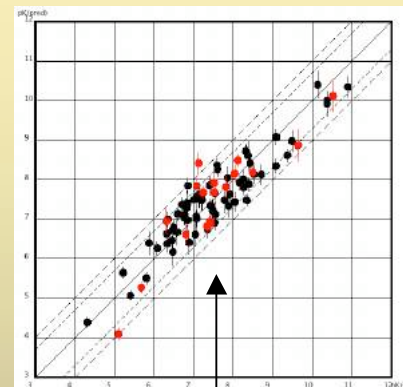


Activity of narcotica correlates with log P



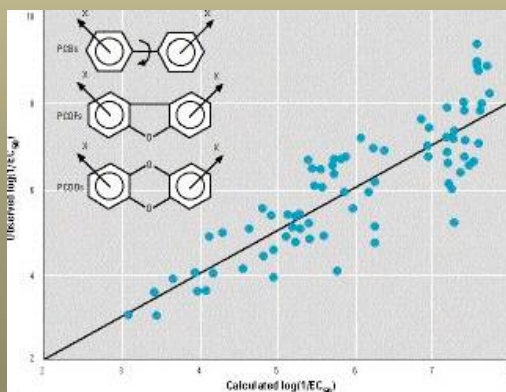
Hans-Horst Meyer, 1899

3D-QSAR

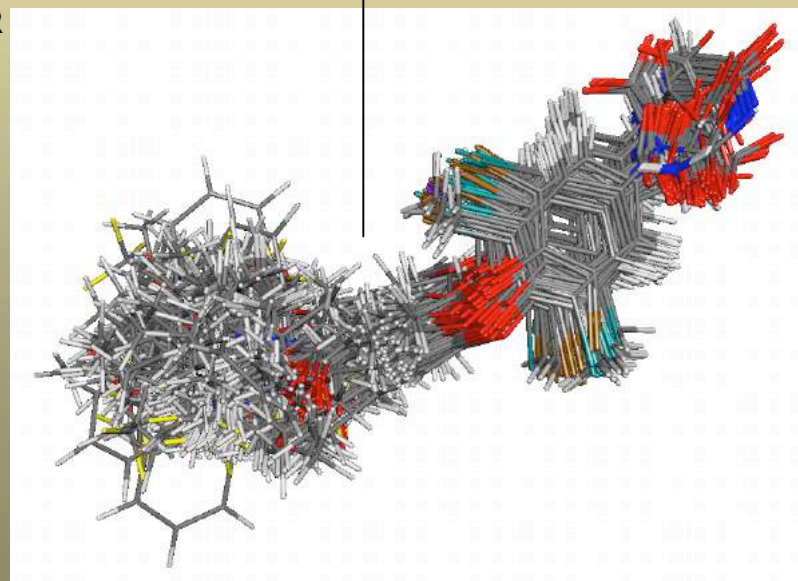


3D-QSAR

2D-QSAR

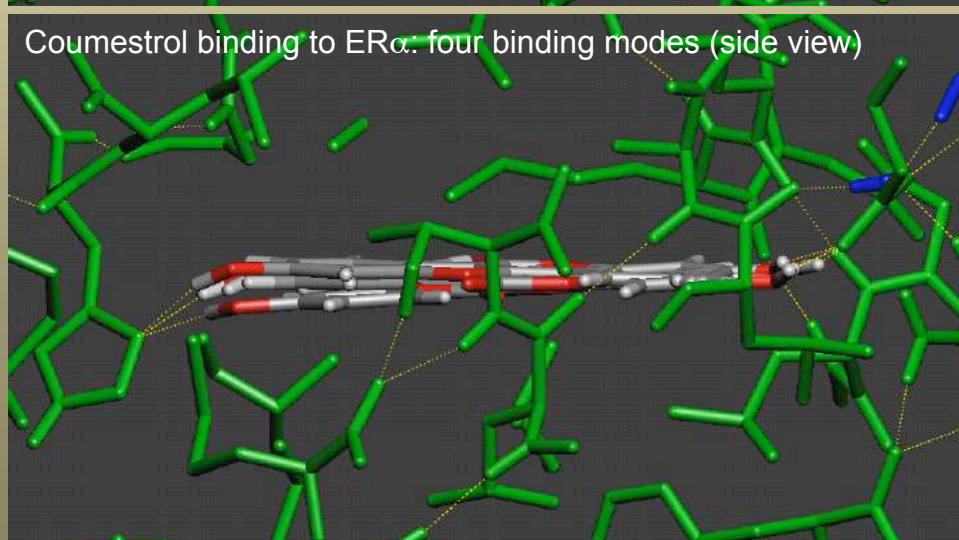
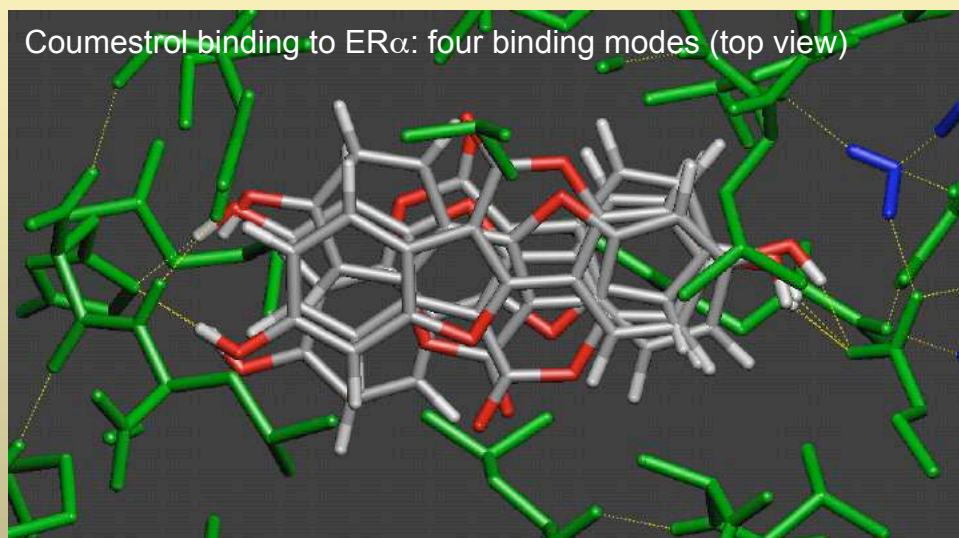


Toxicity of chemicals correlates with structural motives

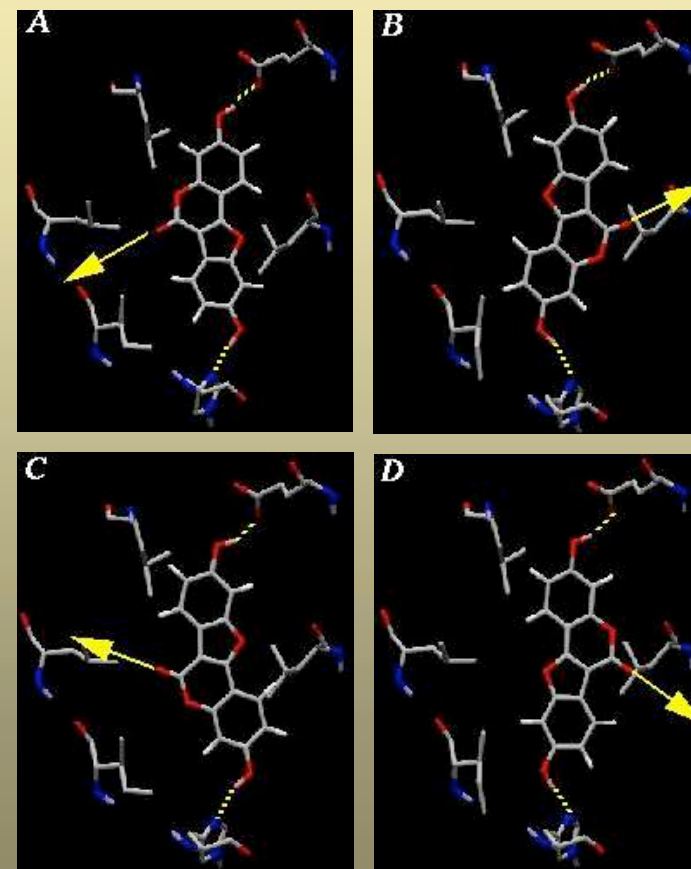


Activity of thyroid antagonists correlates with 3D structure

*ChemMedChem* **2007**, *2*, 78–87

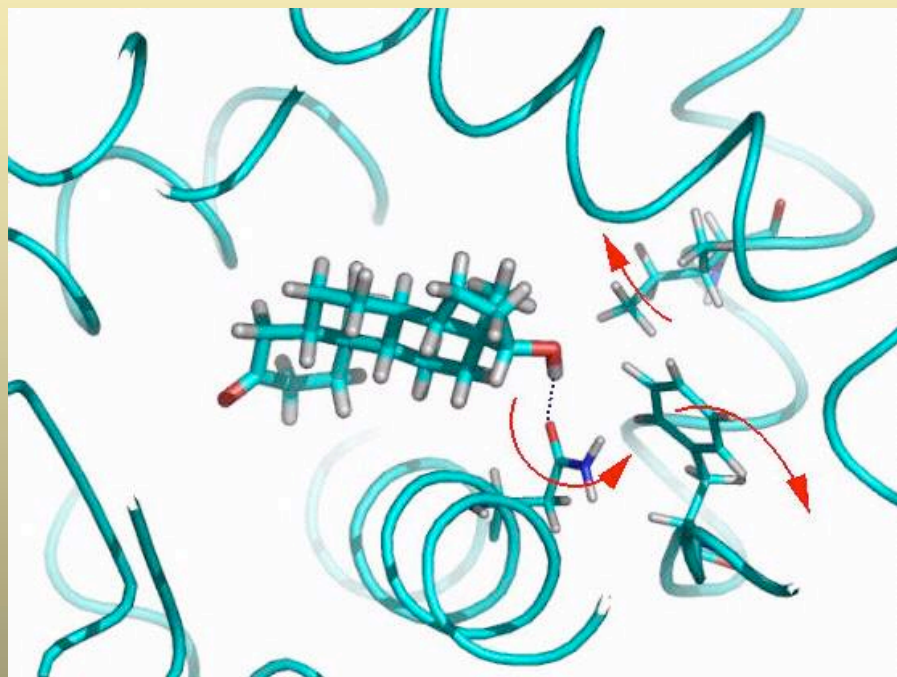


## 4D-QSAR

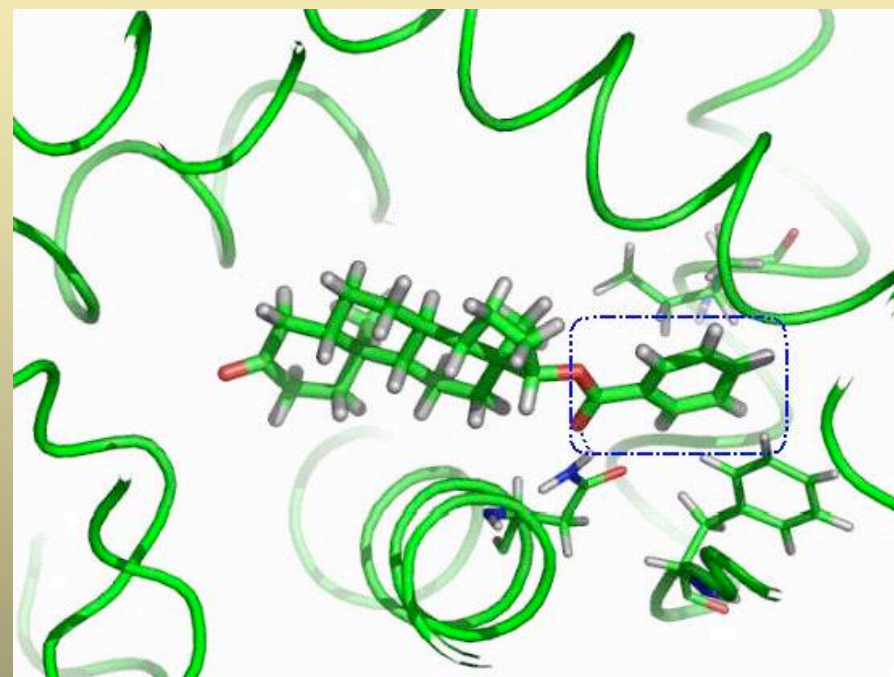


*J. Med. Chem.* **2005**, *48*, 3700–3703

**Induced Fit — Adaptation of the protein to the small-molecule ligand**



Androgen receptor with bound dihydrotestosterone



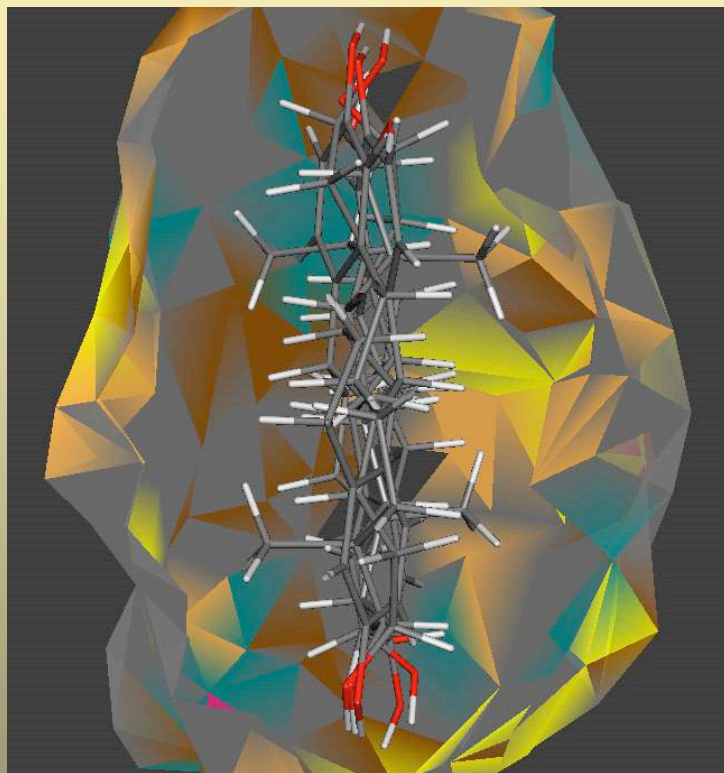
Androgen receptor with bound dihydrotestosterone benzoate

*J. Med. Chem.* **2000**, *46*, 4416–4427

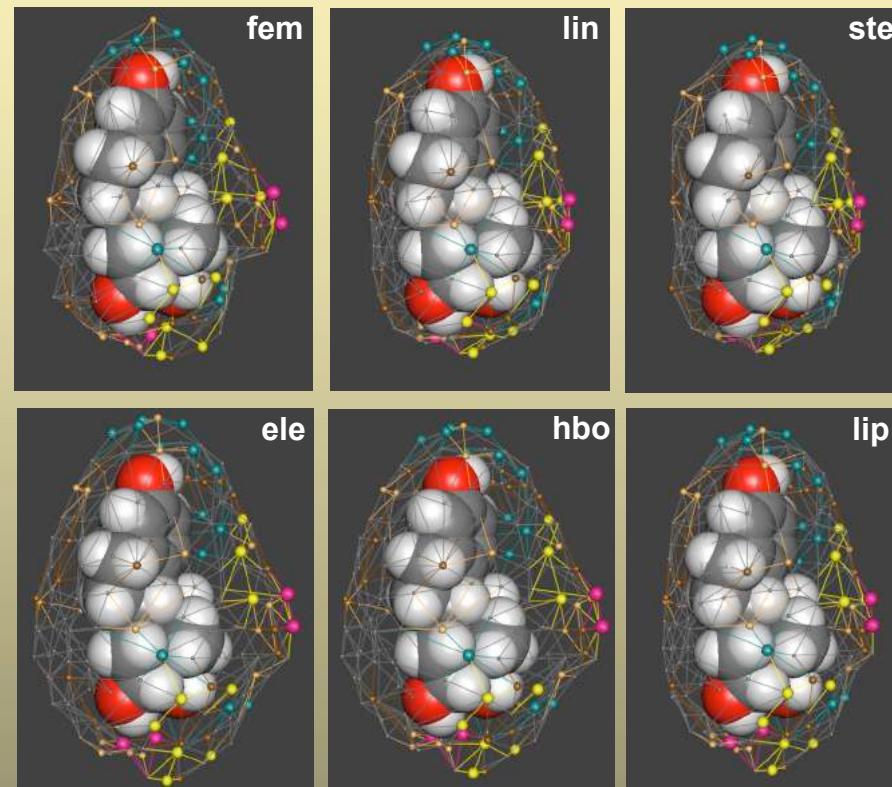
*J. Med. Chem.* **2002**, *45*, 2139–2149

*J. Med. Chem.* **2005**, *48*, 3700–3703

**Multi-dimensional QSAR (mQSAR: software Quasar and Raptor)**



4D-QSAR: ligands are represented as an ensemble of positions, orientations, conformations and protonation states



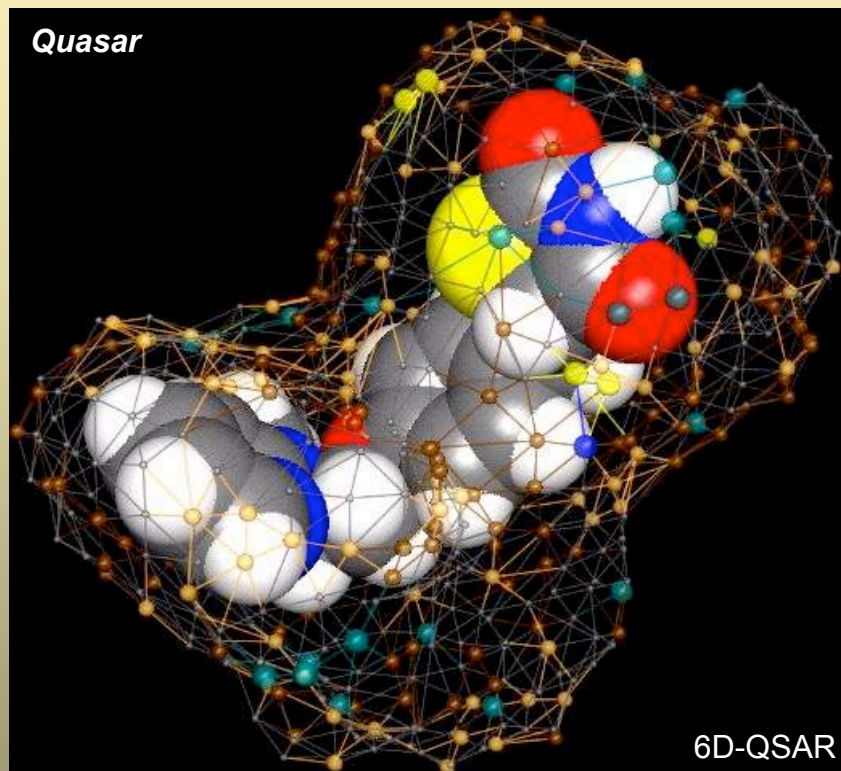
5D-QSAR: protein is represented by several induced-fit scenarios

4D-QSAR: *J. Med. Chem.* **2000**, *46*, 4416–4427

5D-QSAR: *J. Med. Chem.* **2002**, *45*, 2139–2149

6D-QSAR: *J. Med. Chem.* **2005**, *48*, 3700–3703

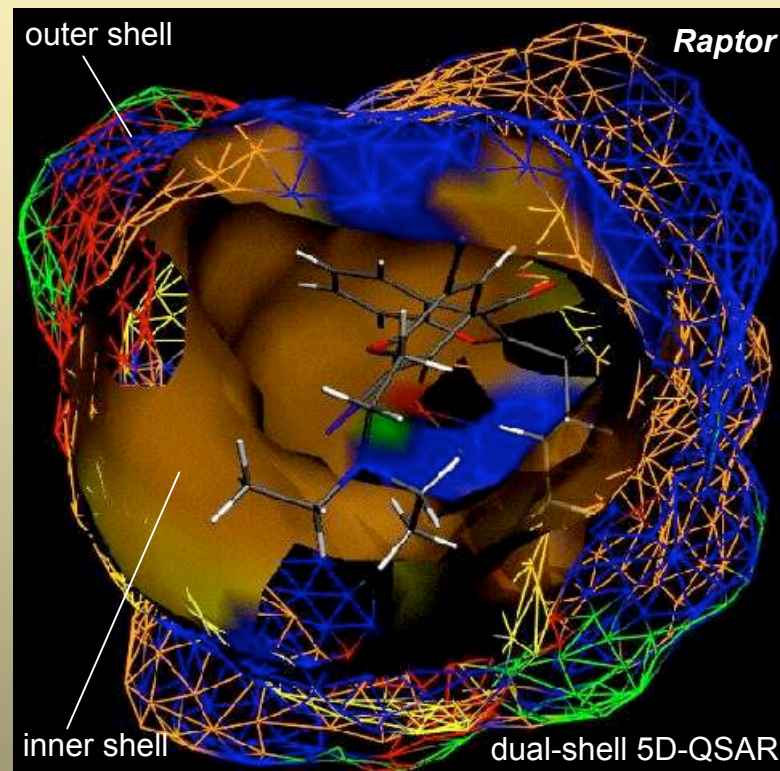
Consensus scoring: software *Quasar* and *Raptor*



$$\Delta G_{\text{binding}} \propto E_{\text{prot-lig}} - E_{\text{solv,lig}} - E_{\text{int,lig}} - T\Delta S - E_{\text{IndFit}}$$

$$E_{\text{prot-lig}} = E_{\text{elec}} + E_{\text{vdW}} + E_{\text{HBond}} + E_{\text{polarization}}$$

*J. Med. Chem.* **2002**, *45*, 2139–2149  
*J. Med. Chem.* **2005**, *48*, 3700–3703

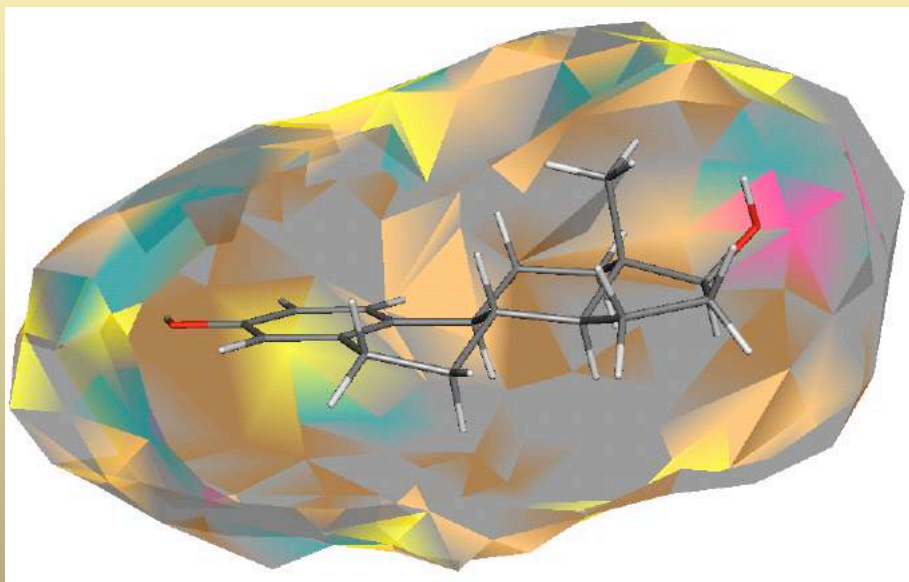


$$\Delta G_{\text{binding}} \propto E_{\text{prot-lig}} - T\Delta S - E_{\text{IndFit}}$$

$$E_{\text{prot-lig}} = E_{\text{HBond}} + E_{\text{hydrophobic}} (\text{shell}_1 + \text{shell}_2)$$

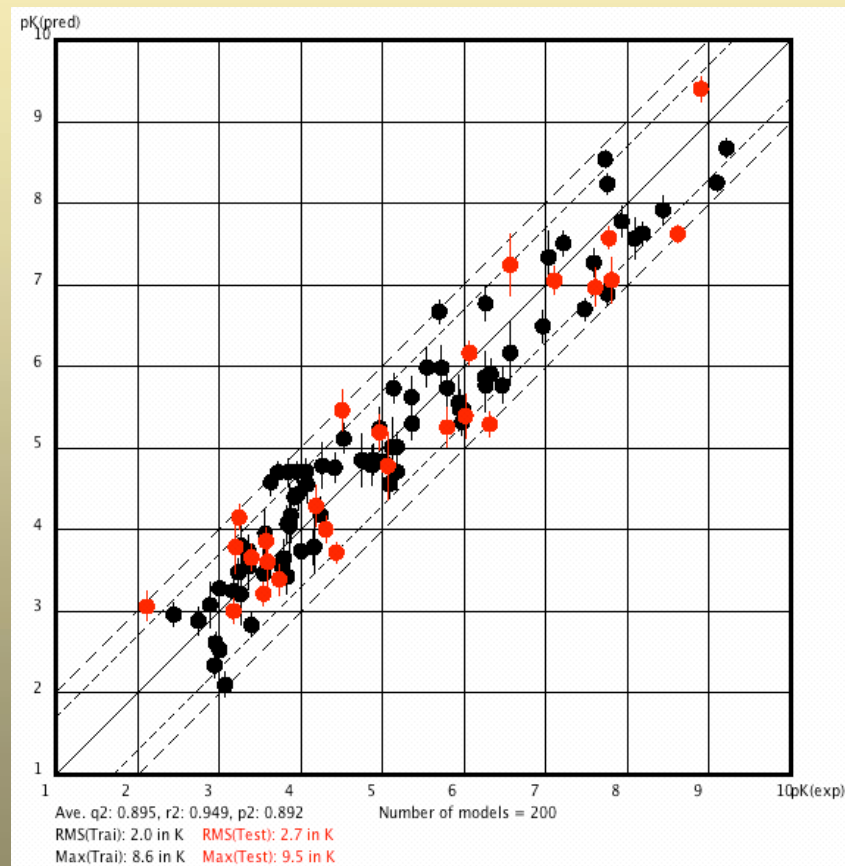
*J. Med. Chem.* **2004**, *47*, 6174–6186

mQSAR models for nuclear receptors: AR, ER $\alpha$  $\beta$ , GR, LXR, MR, PPAR $\gamma$ , TR $\alpha$  $\beta$



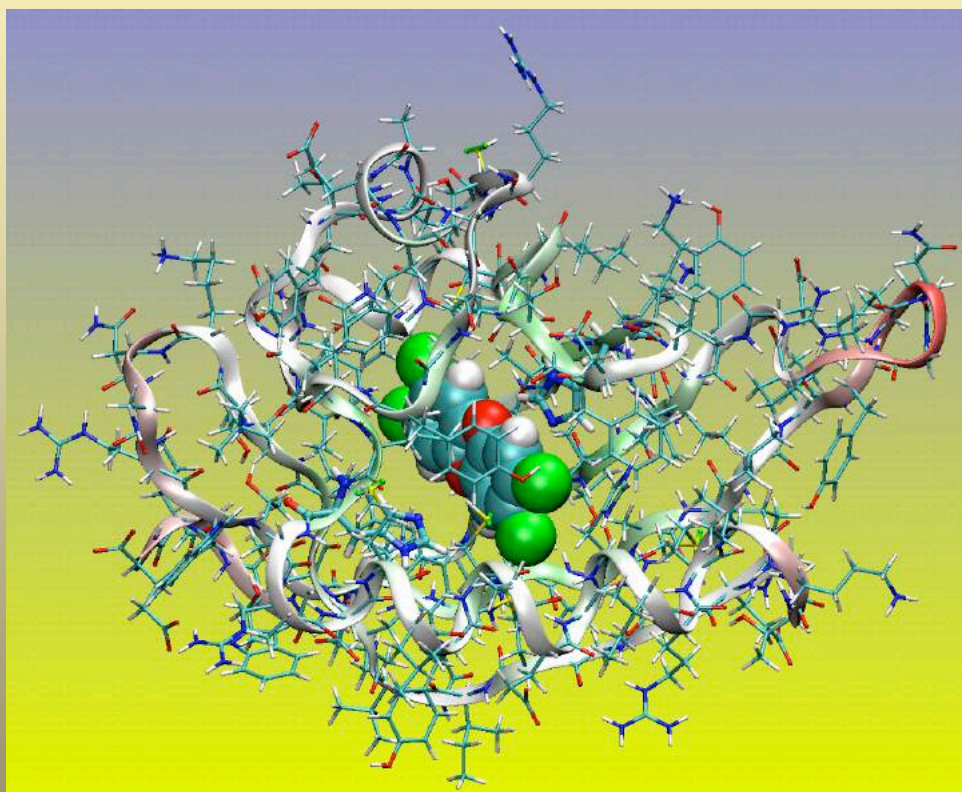
mQSAR model for the estrogen receptor  $\alpha$

*J. Med. Chem.* **2005**, *48*, 3700–3703



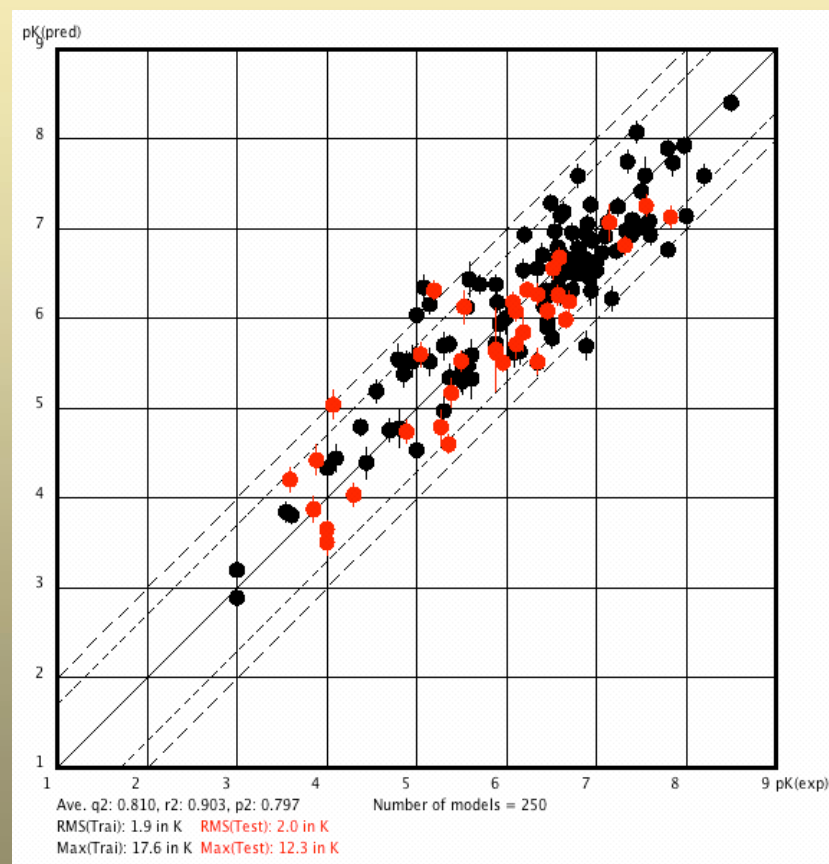
6D-QSAR (software *Quasar*): 106 compounds

### mQSAR model for the Aryl hydrocarbon receptor



MM/MD optimized homology model of the AhR with bound TCDD

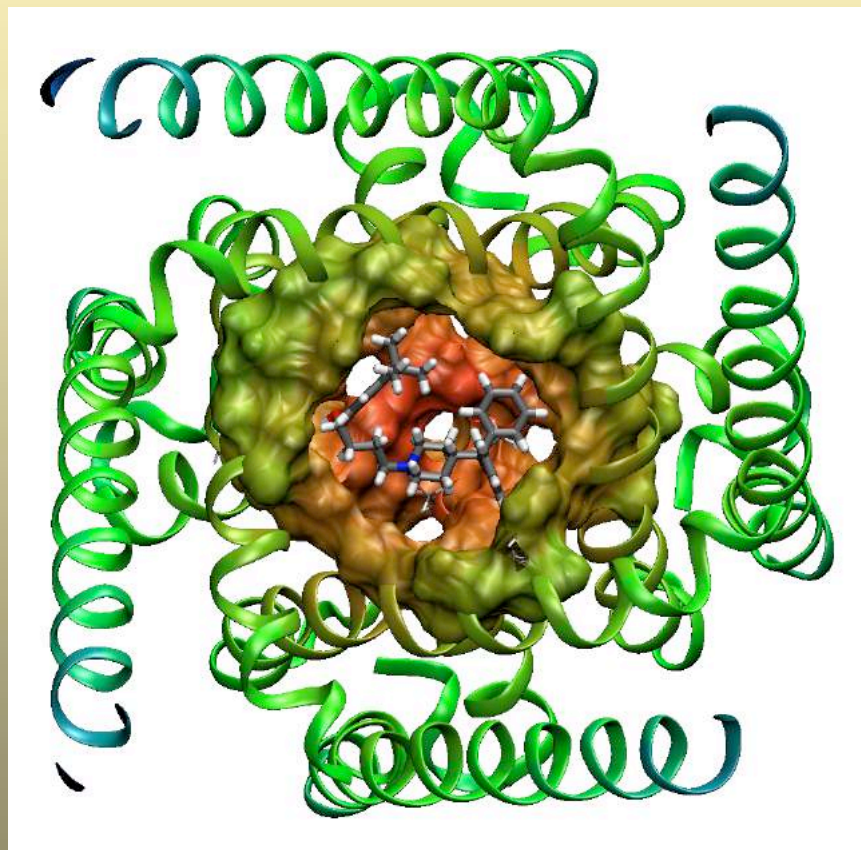
*Pharmacol. Toxicol.* **2006**, *99*, 195–208



6D-QSAR (software *Quasar*): 140 compounds

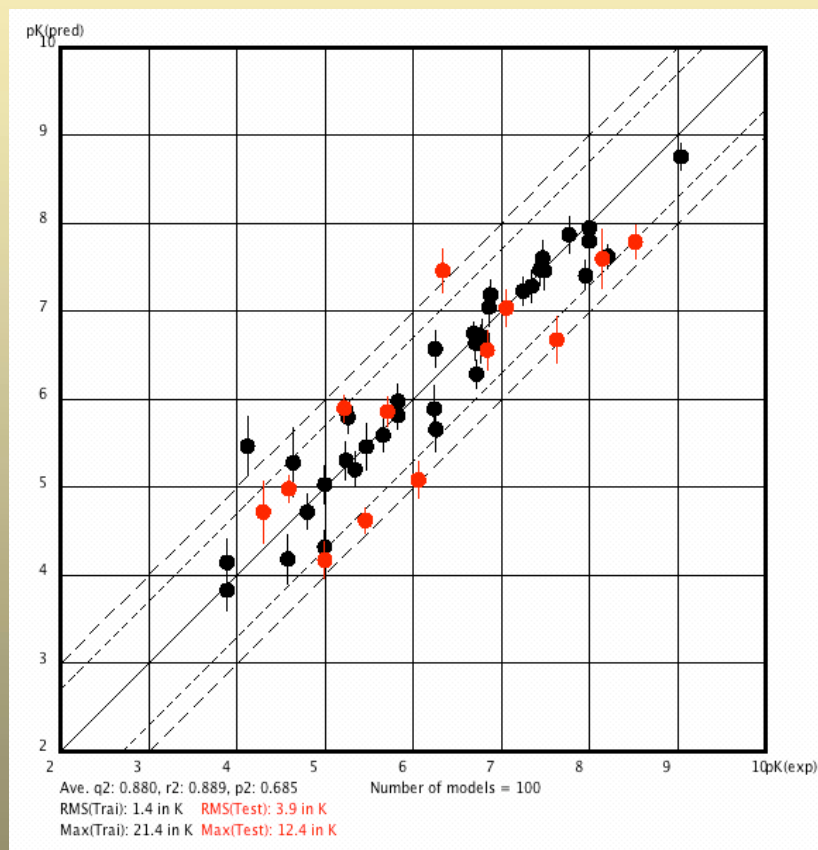


mQSAR model for the hERG K<sup>+</sup> channel



hERG: homology model with docked (*S*)-terfenadine

ATLA 2009, 37, 477–496

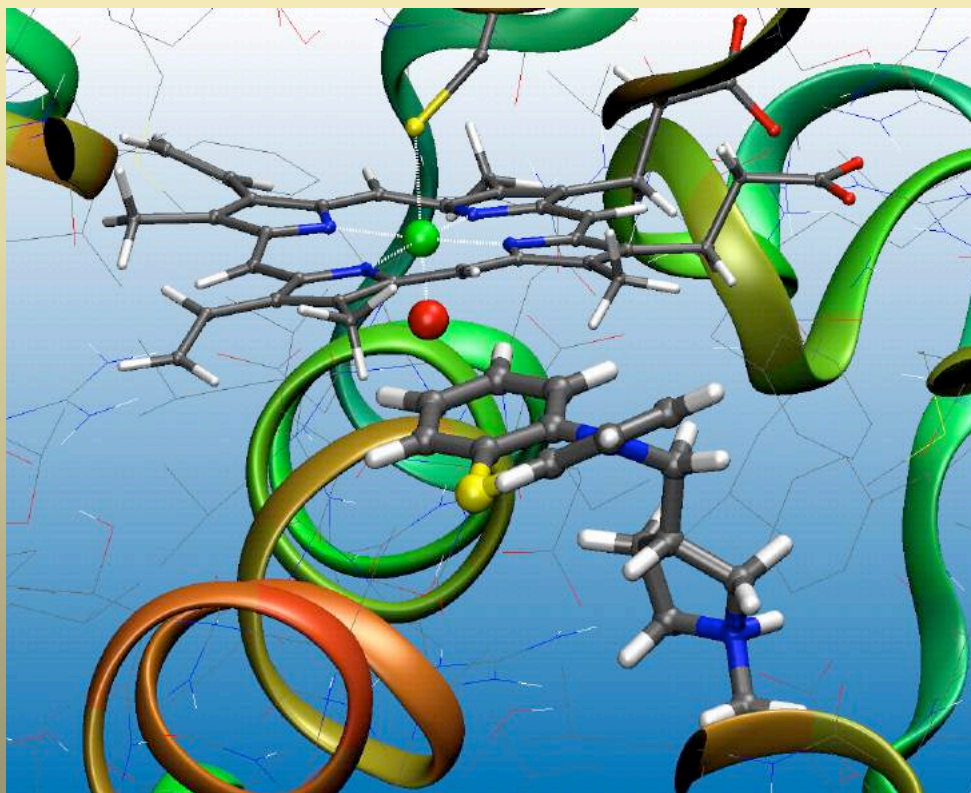


6D-QSAR (software *Quasar*): 50 compounds

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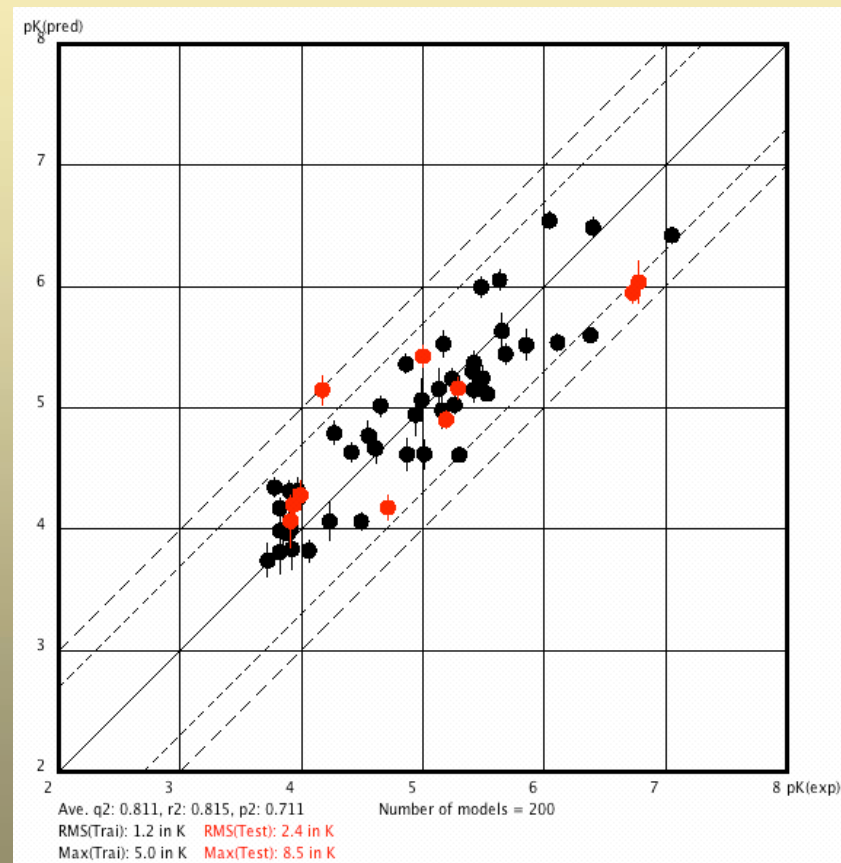
VirtualToxLab™ — In silico prediction of the toxic potential of drugs and chemicals

## mQSAR models for metabolizing enzymes: CYP1A2, CYP2A13, CYP2C9, CYP2D6, CYP3A4



Binding pocket of CYP450 2D6 with bound methdilazine

*ChemMedChem.* **2010**, *5*, 2088–2101

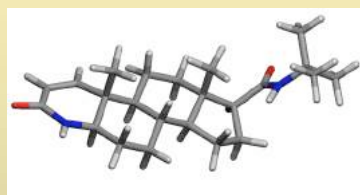


6D-QSAR (software *Quasar*): 56 compounds

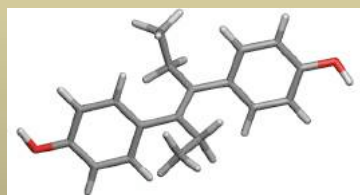
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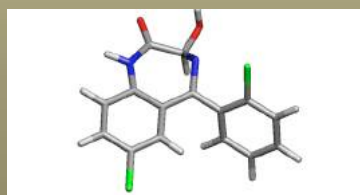
## Using a mQSAR model for predictive purposes (example: ER $\alpha$ )



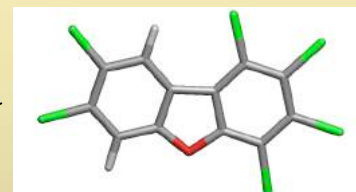
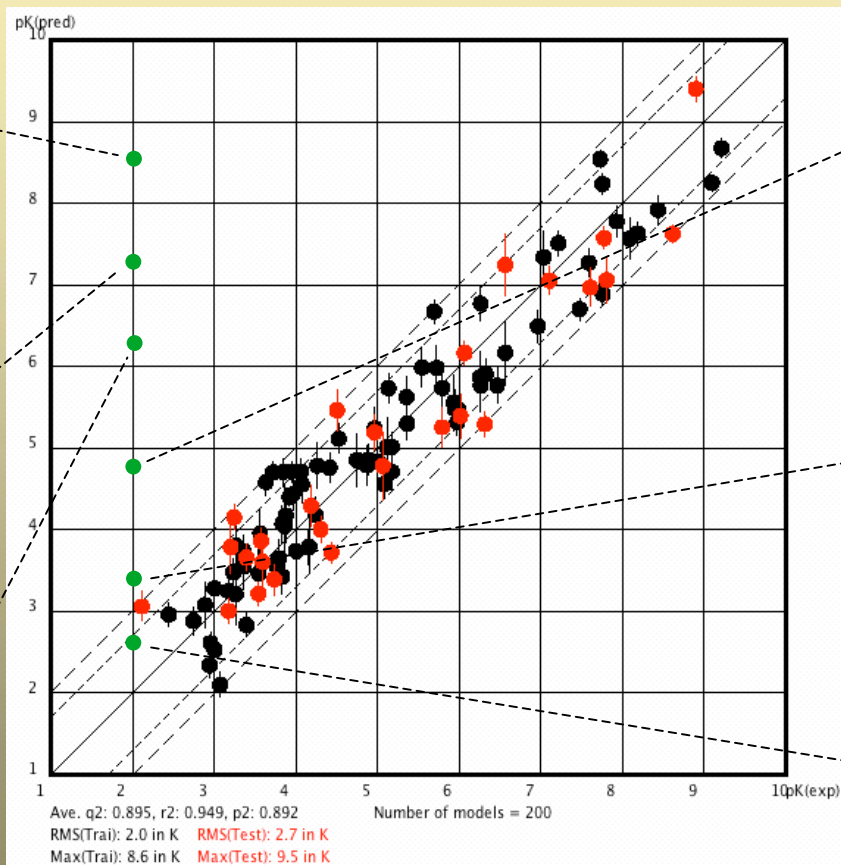
Finasteride



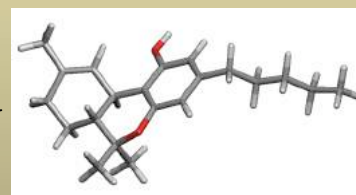
Diethylstilbestrol



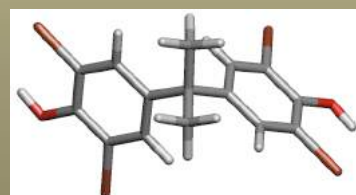
(R)-Lorazepam



1,2,3,4,7,8-  
Hexachlorodibenzofuran



Tetrahydrocannabinol



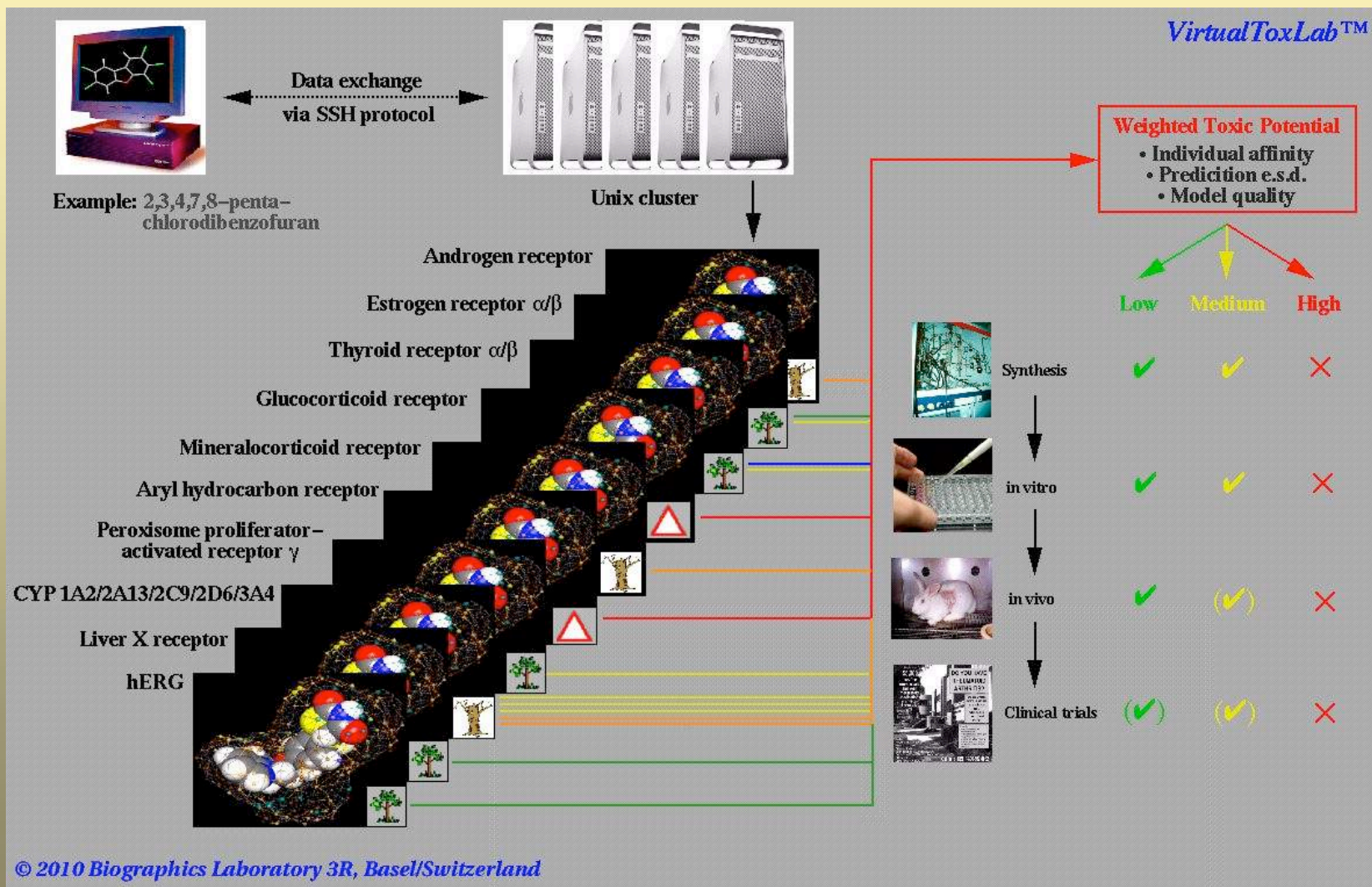
2,2',6,6'-Tetrabromobisphenol A

**Summary: Virtual Test Kits**

Protein	training + test = total compounds	$q^2$	$p^2$	max. test	Reference
<i>Receptors</i>					
Androgen	88 + 26 = 114	0.858	0.792	13.9	<i>J. Med. Chem.</i> 2005b
Aryl hydrocarbon	105 + 35 = 140	0.824	0.769	13.5	<i>Pharmacol. Toxicol.</i> 2006
Estrogen $\alpha$	80 + 26 = 106	0.895	0.892	9.5	<i>J. Med. Chem.</i> 2005a
Estrogen $\beta$	72 + 24 = 96	0.802	0.699	13.4	<i>ALTEX</i> 2009
Glucocorticoid	88 + 22 = 110	0.702	0.719	4.9	<i>ChemMedChem</i> 2009
hERG	38 + 12 = 50	0.935	0.754	4.9	<i>ATLA</i> 2009
Liver X	40 + 12 = 52	0.763	0.697	3.3	<i>Mol. Inf.</i> 2010
Mineralocorticoid	40 + 8 = 48	0.810	0.661	4.2	<i>Toxicol. Lett.</i> 2009
PPAR $\gamma$	75 + 20 = 95	0.832	0.723	3.9	<i>Toxicol. Lett.</i> 2007
Thyroid $\alpha$	64 + 18 = 82	0.919	0.814	10.0	<i>ChemMedChem</i> 2007
Thyroid $\beta$	64 + 18 = 82	0.909	0.796	8.8	<i>ChemMedChem</i> 2007
<i>Enzymes</i>					
CYP 1A2	40 + 12 = 52	0.881	0.651	3.4	<i>ATLA</i> 2009
CYP 2A13	18 + 6 = 24	0.854	0.661	1.7	<i>Chimia</i> 2008
CYP 2C9	68 + 17 = 85	0.687	0.423	4.8	<i>ChemMedChem</i> 2010
CYP 2D6	40 + 10 = 56	0.811	0.711	8.5	<i>ChemMedChem</i> 2010
CYP 3A4	38 + 10 = 48	0.825	0.659	7.1	<i>ChemMedChem</i> 2006

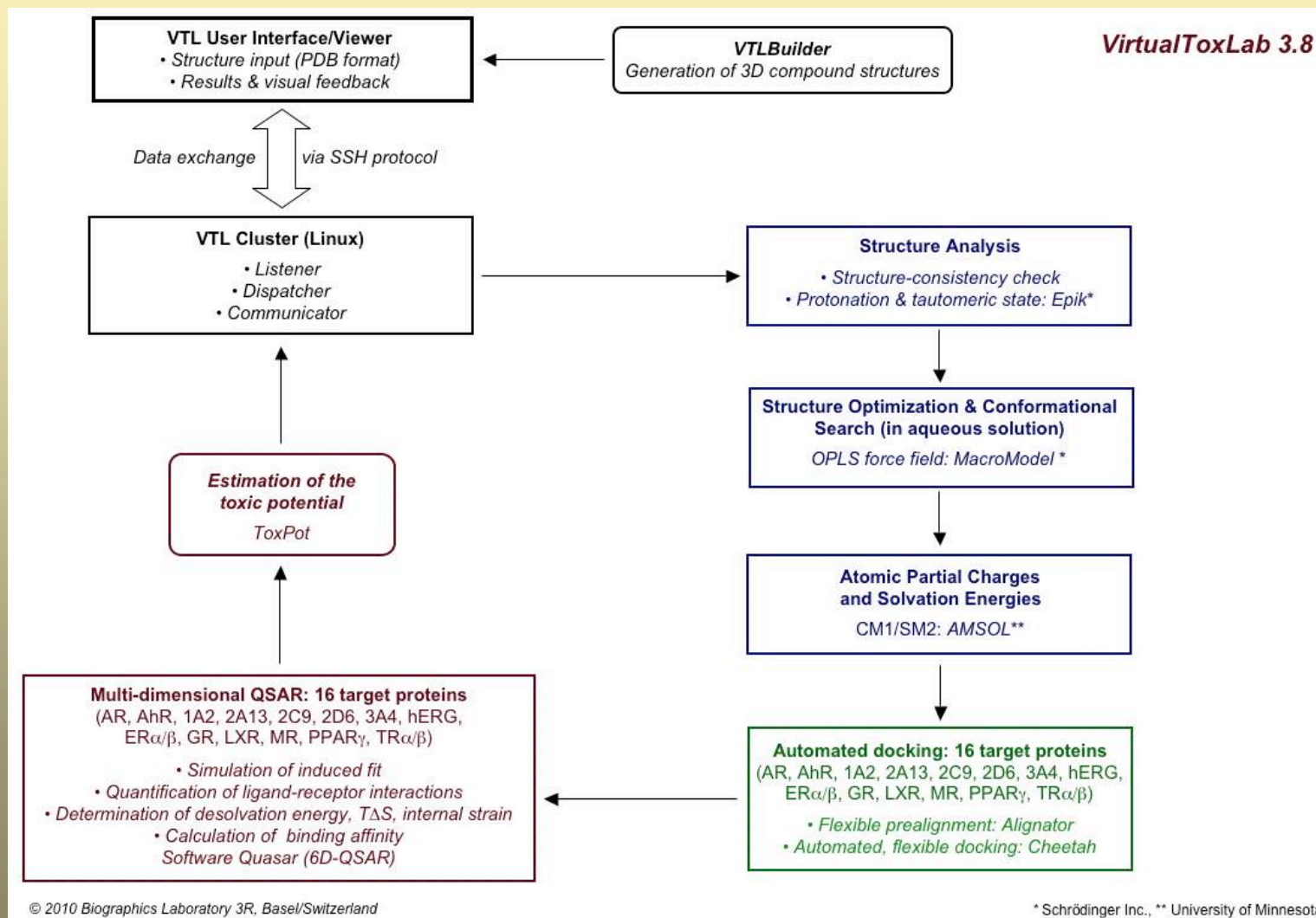
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VirtualToxLab™ — In silico prediction of the toxic potential of drugs and chemicals



# zh aw — 3. Wädenswiler Chemie-Tag 16. Juni 2011

VirtualToxLab™ — In silico prediction of the toxic potential of drugs and chemicals

The screenshot displays the VirtualToxLab interface, which is used for in silico prediction of the toxic potential of drugs and chemicals. The interface is divided into several sections:

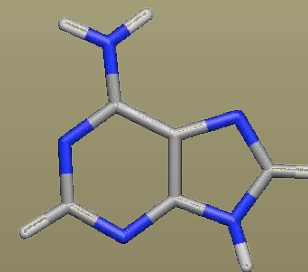
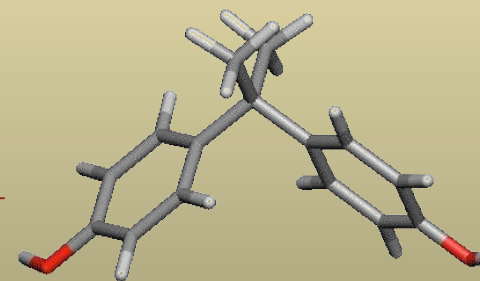
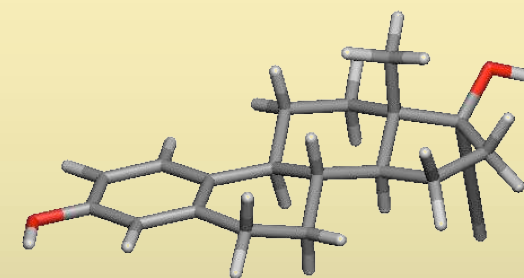
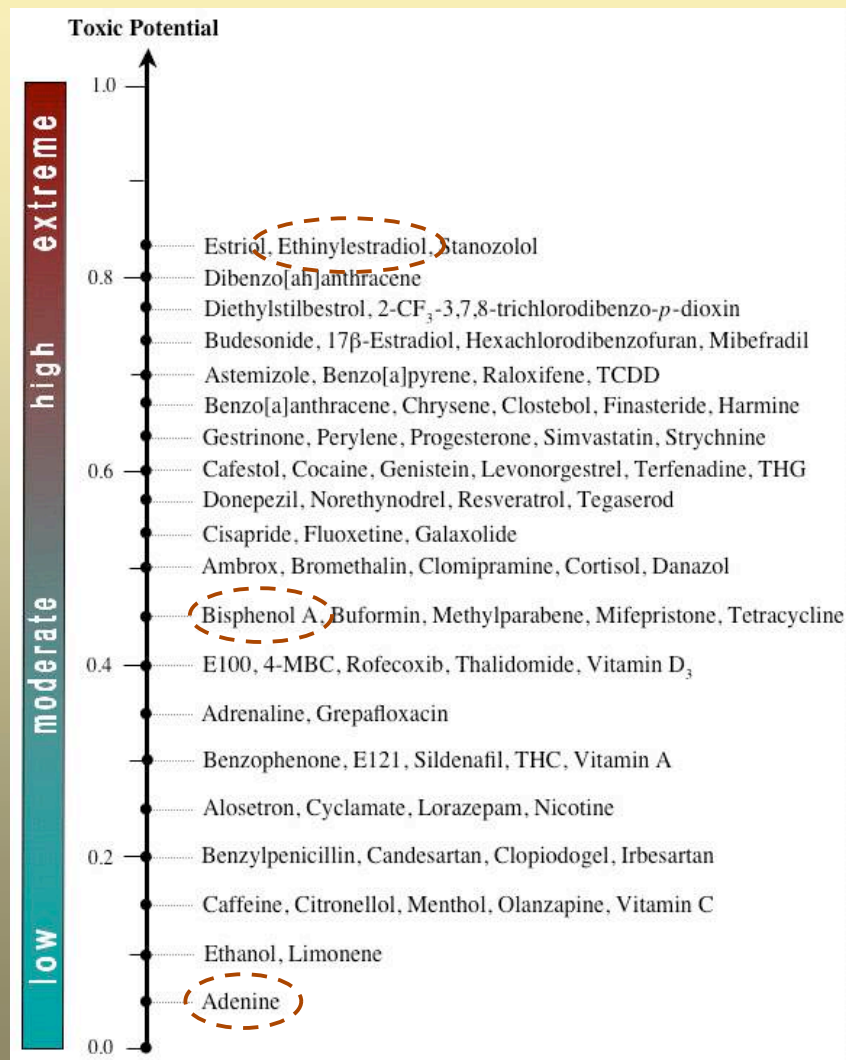
- Molecule manager:** A table listing various molecules and their predicted toxic potentials across multiple targets. The table includes columns for the molecule name and its predicted potential for targets such as Androgen, Aryl hydrocarbon, CYP450 1A2, CYP450 2A13, CYP450 2C9, CYP450 2D6, CYP450 3A4, hERG, Estrogen alpha, Estrogen beta, Glucocorticoid, Liver X, Mineralocorticoid, PPAR gamma, Thyroid alpha, and Thyroid beta.
- 3D Model Builder:** A section for selecting target proteins and viewing the 3D structure of the ligand-protein complex. The selected targets include Androgen, Aryl Hydrocarbon, CYP450-1A2, CYP450-2A13, CYP450-2C9, CYP450-2D6, CYP450-3A4, HERG K+ channel, Estrogen alpha, Estrogen beta, Glucocorticoid, Liver X, Mineralocorticoid, PPAR gamma, Thyroid alpha, and Thyroid beta. The structure file is shown as `/Users/Biograf/VirtualToxLab/Genistein.pdb`.
- Weighted Toxic Potential:** A table showing the weighted toxic potential for the selected molecules. The table includes columns for Molecule, Number of targets, Weighted Toxic Potential, WTP Class, Main target, and Launch time.
- 3D Binding Mode:** A 3D visualization of the ligand-protein complex, showing the ligand (Genistein) bound to the protein (ERb).

The following table shows the Weighted Toxic Potential for the molecules listed in the interface:

Molecule	Number of targets	Weighted Toxic Potential	WTP Class	Main target	Launch time
Dibenzo[ah]anthracene	16	0.814	****	AhR	8 Dec 10 15:42:22
Diethylstilbestrol	16	0.775	***	ERa	8 Dec 10 15:42:29
17β-Estradiol	16	0.769	***	ERb	8 Dec 10 15:42:35
Estriol	16	0.545	**	ERa	8 Dec 10 15:42:46
Ethinylestradiol	16	0.825	****	ERb	8 Dec 10 15:42:52
Finasteride	16	0.738	***	ERb	8 Dec 10 15:45:52
(R)-Fluoxetine	16	0.518	**	GR	8 Dec 10 15:46:00
(S)-Fluoxetine	16	0.463	*	GR	8 Dec 10 15:46:07
Fluticasone	16	0.485	*	GR	8 Dec 10 15:46:14
Genistein	16	0.565	**	ERb	8 Dec 10 15:46:20

# zh aw — 3. Wädenswiler Chemie-Tag 16. Juni 2011

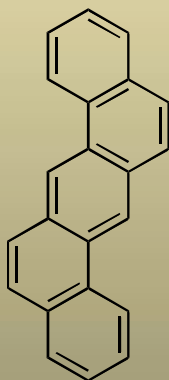
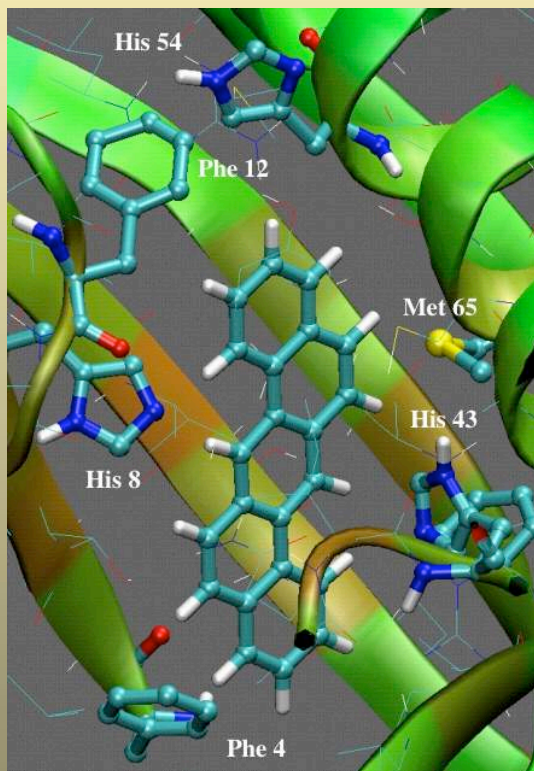
VirtualToxLab™ — In silico prediction of the toxic potential of drugs and chemicals





### Atomistic interpretation of the results I

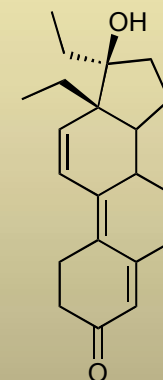
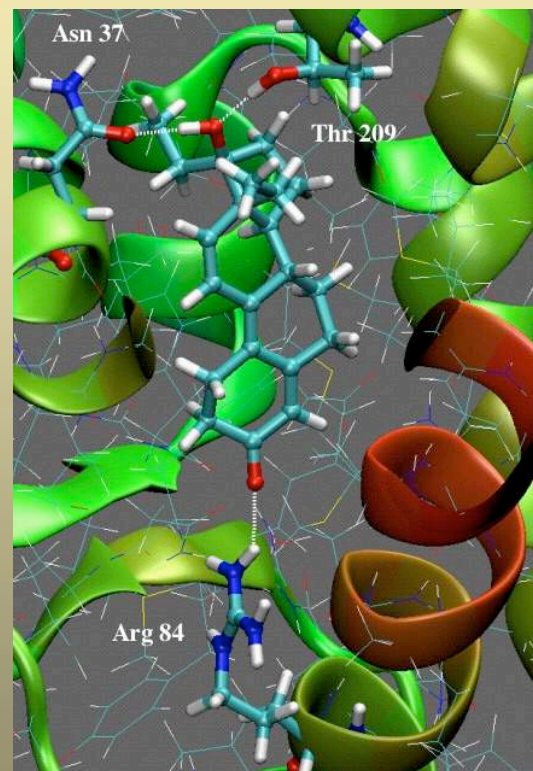
Dibenzo[ah]anthracene → Aryl hydrocarbon receptor



**Toxic potential = 0.831**

Binding affinities: AhR = 6.8 nM, GR = 110 nM, LXR = 310 nM

Tetrahydrogestrinone → Androgen receptor



**Toxic potential = 0.621**

Binding affinities: AR = 9.5 nM, MR = 150 nM, GR = 160 nM

### Tetrahydrogestrinone — „The Clear“

**Tetrahydrogestrinone**  
From Wikipedia, the free encyclopedia

**Tetrahydrogestrinone** (often referred to as **THG** or **The Clear**) is an anabolic steroid developed by Patrick Arnold.<sup>[1]</sup> It has affinity to the androgen receptor and the progesterone receptor, but not to the estrogen receptor.<sup>[2]</sup> The drug has been considered a designer drug, closely related to the banned anabolic steroids gestrinone and trenbolone,<sup>[3]</sup> and was **banned** by the Food and Drug Administration (FDA) at the end of 2003.<sup>[citation needed]</sup>

**Contents** [hide]

- Pharmacology
- Method of action
- Side effects
- History
- See also
- References
- External links

**Pharmacology** [edit]

Structure-activity relationship studies report that the potency of the drug is outstanding, surpassing, on a milligram per milligram basis, every known synthesized or commercial available anabolic steroid at the time of its development. It is a highly potent agonist for the androgen and progesterone receptors,<sup>[4]</sup> around 10 times more potent than the comparison drugs nandrolone or trenbolone, but with no estrogenic activity. It has been found to bind to the androgen receptor with similar affinity to dihydrotestosterone and produces growth of muscle tissue.<sup>[5]</sup> According to Patrick Arnold, due the drug's potency, he never had to supply significant quantities to BALCO, because "just a couple of drops under the tongue" were a sufficient dose.<sup>[1]</sup>

**Method of action** [edit]

When THG reaches the nucleus of a cell, it binds to the androgen receptor at the ligand-binding pocket. Here it changes the expression of a variety of genes, turning on several anabolic and androgenic functions.<sup>[6]</sup>

It is the ligand's structure which determines the number of interactions that can take place with the human androgen receptor ligand-binding domain. Even minor modifications in the ligand's structure have a great impact on the strength of the interactions this ligand has with the androgen receptor. THG, possessing a high affinity, establishes more van der Waals contacts with the receptor than with many other steroids. It is this higher affinity and specific geometry of THG which makes these interactions with the Androgen Receptor so strong, resulting in THG's potency.<sup>[7]</sup>

**Side effects** [edit]

Side effects from prolonged use are likely to include infertility in both men and women, as well as other steroid side effects such as acne and hirsutism.<sup>[8]</sup> Unlike most other anabolic steroids, THG also binds with high affinity to the glucocorticoid receptor, and while this effect may cause additional weight loss, it is also likely to cause extra side effects such as immunosuppression that are not seen with most other steroids.<sup>[9]</sup>

**Tetrahydrogestrinone**

**Systematic (IUPAC) name**  
(13S,17S)-13,17-dihydro-17-hydroxy-1,2,6,7,8,13,14,15,16,17-decahydrocyclopenta[a]phenanthren-3-one

**Identifiers**

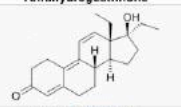
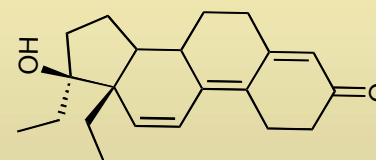
**CAS number** 61893-56-3  
**ATC code** ?  
**ChemSpider** 20581259

**Chemical data**

**Formula** C<sub>21</sub>H<sub>32</sub>O<sub>2</sub>  
**Mol. mass** 312.46 g/mol  
**Synonyms** Tetrahydrogestrinone, THG, The Clear

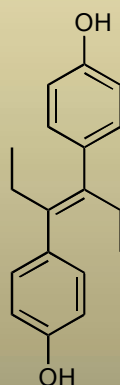
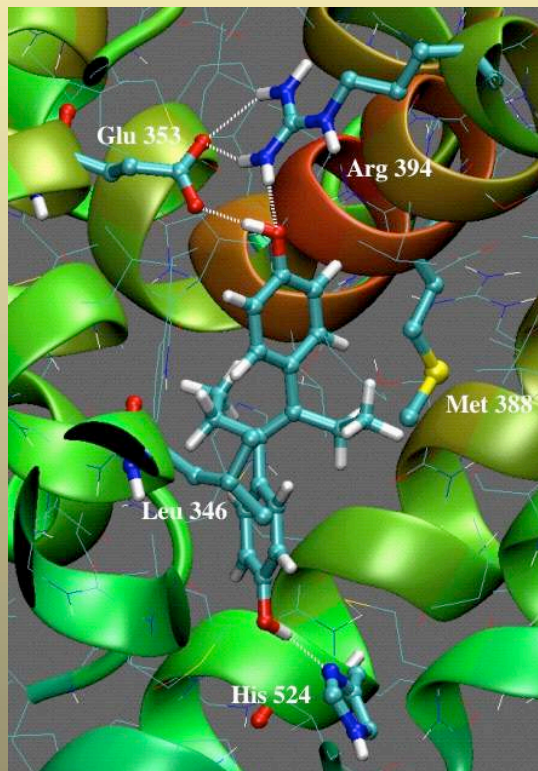
**Therapeutic considerations**

**Pregnancy cat.** ?  
**Legal status** Schedule I (US)  
**Routes** Oral, intramuscular

## Atomistic interpretation of the results II

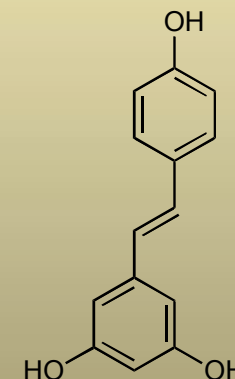
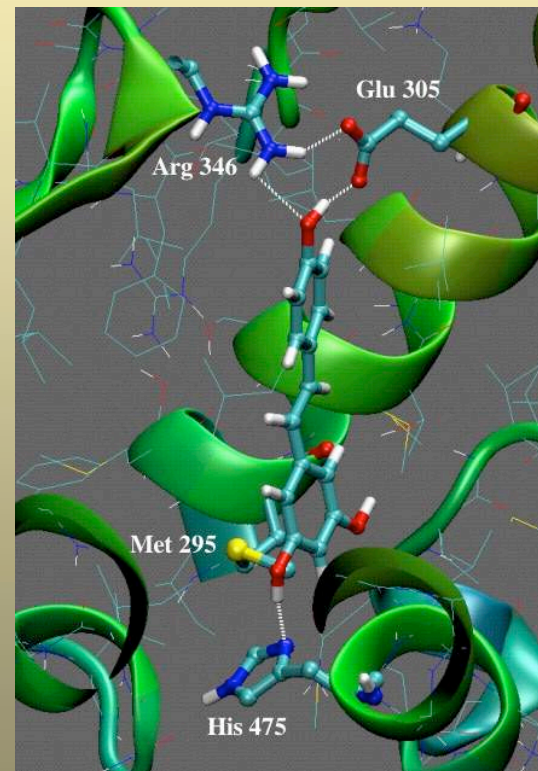
Diethylstilbestrol → Estrogen receptor  $\alpha$



**Toxic potential = 0.756**

Binding affinities: ER $\beta$  = 2.4 nM, ER $\alpha$  = 9.4 nM, GR = 210 nM

Resveratrol → Estrogen receptor  $\alpha$

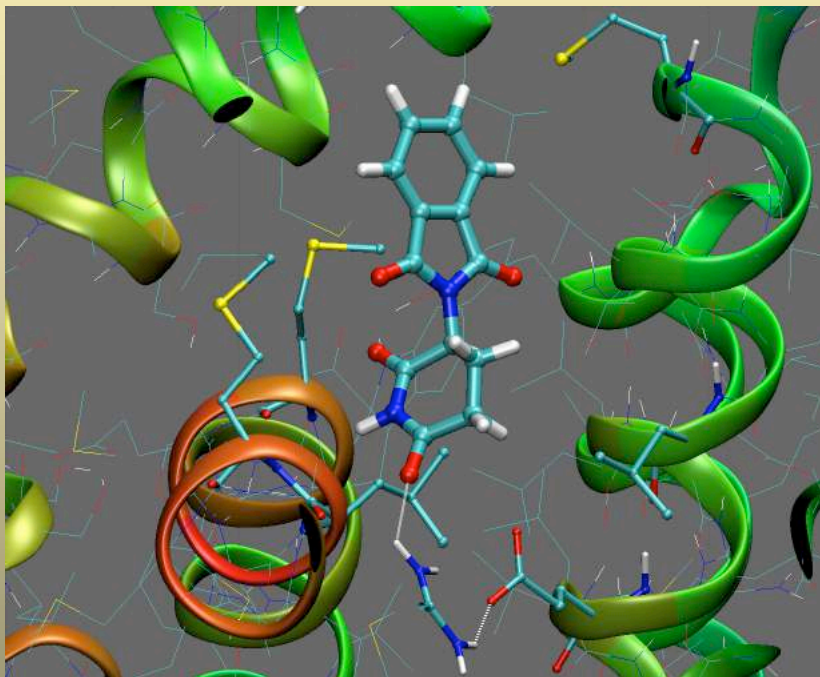


**Toxic potential = 0.718 (MD: 0.574)**

Binding affinities: ER $\beta$  = 0.62 nM, ER $\alpha$  = 1.5  $\mu$ M, GR = 1.5  $\mu$ M

### Atomistic interpretation of the results III

(S)-Thalidomid(sedative) → Estrogen receptor  $\beta$



**Toxic potential = 0.378**

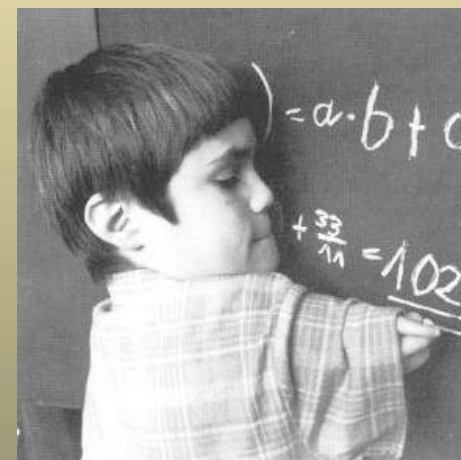
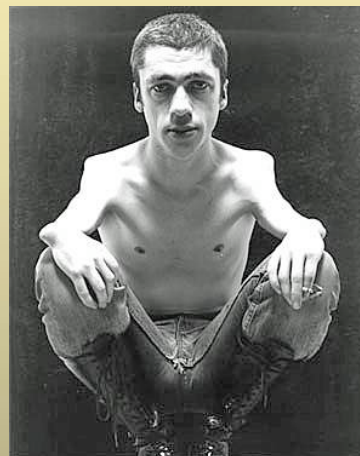
Highest binding affinity: ER  $\beta$  = 0.9  $\mu$ M

The primary target of thalidomide is cereblon (CRBN).

CRBN forms an E3 ubiquitin ligase complex with damaged DNA binding protein 1 (DDB1)

→ Science **2010**, 327, 1345–1350

Contergan tragedy: Federal Republic Germany (1961)

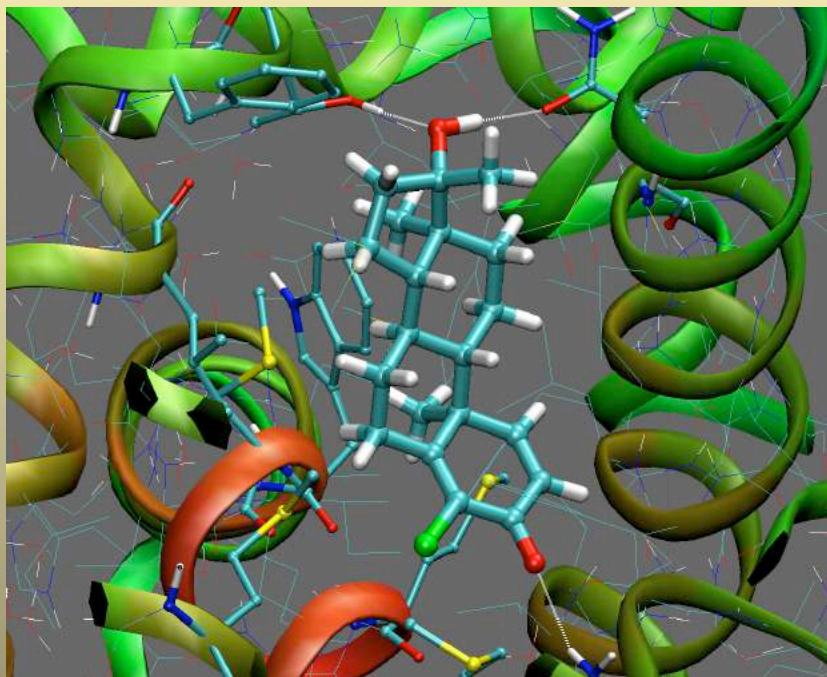


☞ **5,000–10,000 Contergan-geschädigte Kinder**

1957–1961 als Beruhigungs- und Schlafmittel vertrieben, u.a. gegen die morgendliche “Schwangerschaftsübelkeit”. Thalidomid galt aufgrund von Tierversuchen als **besonders sicher** (...)

### Atomistic interpretation of the results IV

Dehydrochloromethyltestosterone → Androgen receptor



**Toxic potential = 0.723**  
Highest binding affinity: AR = 6.2 nM

„Side effects“ of Oral-Turinabol (doping agent in the DDR):

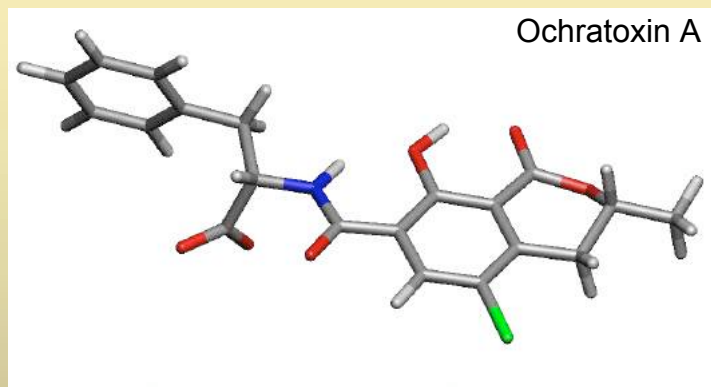


Heidi Krieger (1986)



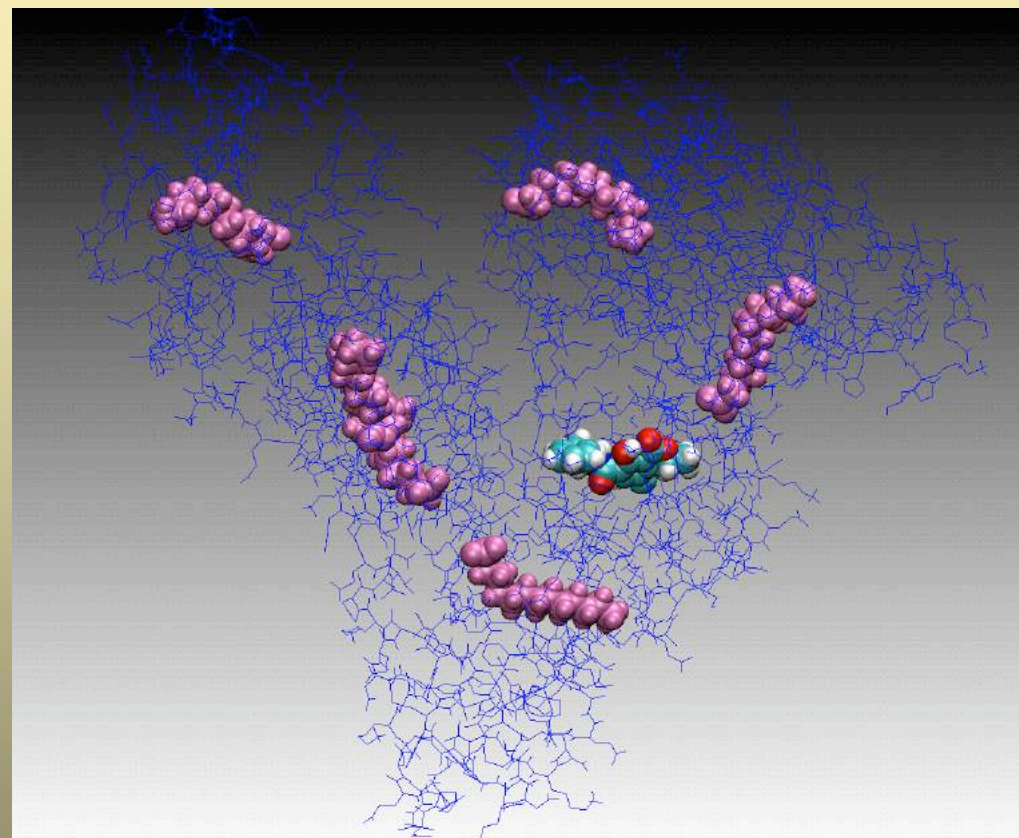
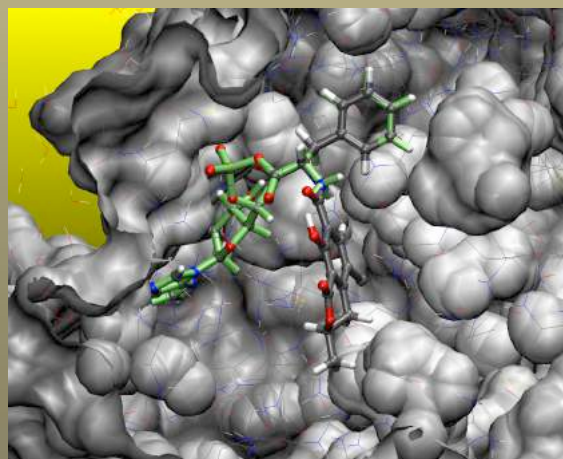
Andreas Krieger (2000)

### Limitation: false-negative predictions



Example: **Ochratoxin A** (mycotoxin, carcinogenic in mice), world-wide problem

ToxPot = 0.228 → does not bind to any of the 16 target proteins

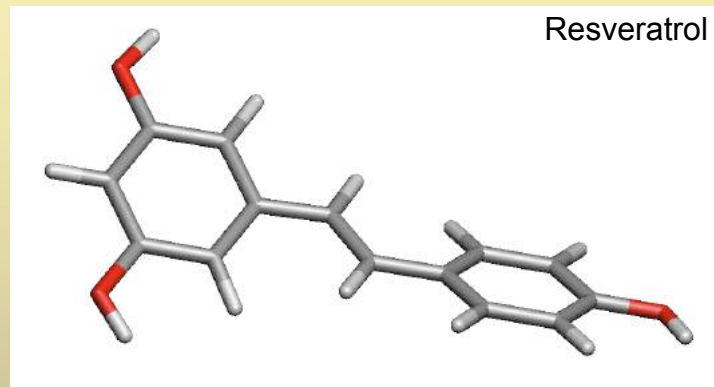


Ochratoxin A binds to human serum albumin and, therefore, is retained in the body for too long periods of time. The primary target for toxicity is unknown. Hypotheses that it binds to Phe-metabolizing enzymes could not be verified *in silico* and *in vitro*.

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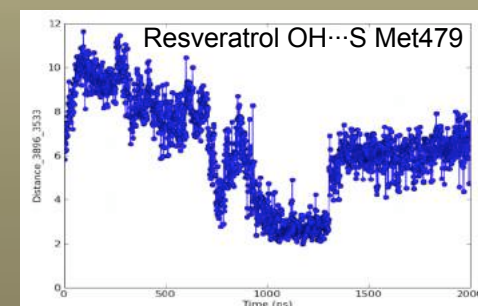
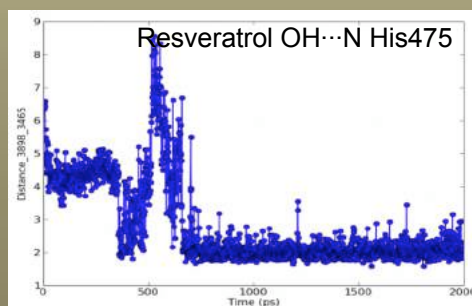
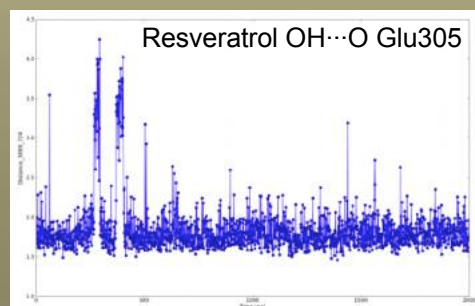
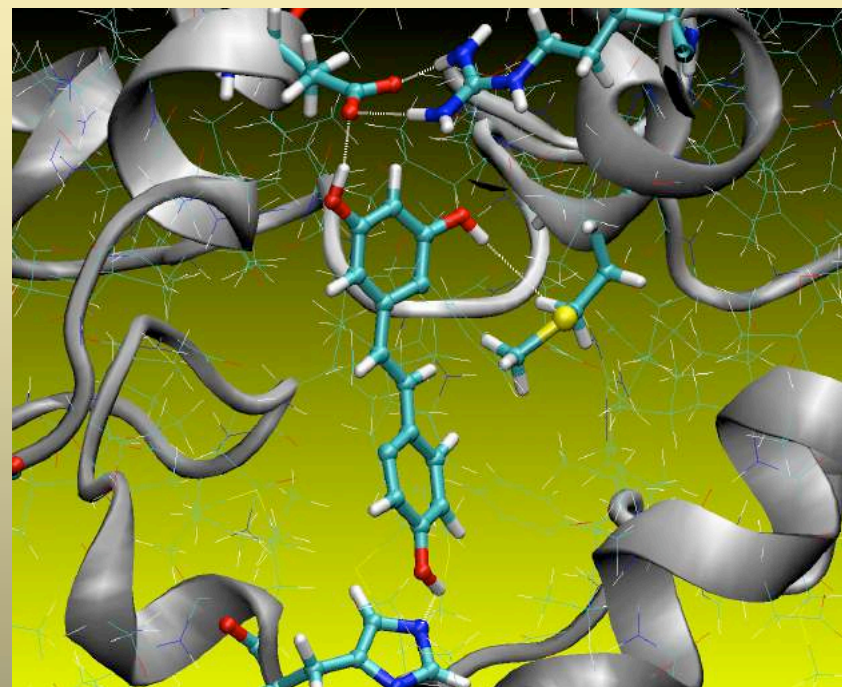
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## Limitation: false-positive predictions



Reasons: compound is not bioavailable  
complex is thermodynamically favorable but  
kinetically unstable

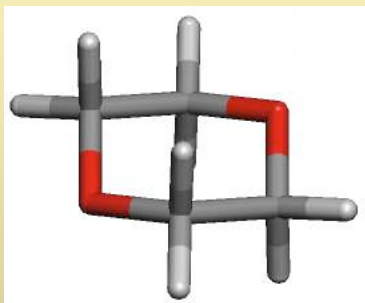
Example: Resveratrol (phytoalexin), ToxPot = 0.718  
subsequent molecular-dynamics simulations  
suggest ToxPot < 0.6



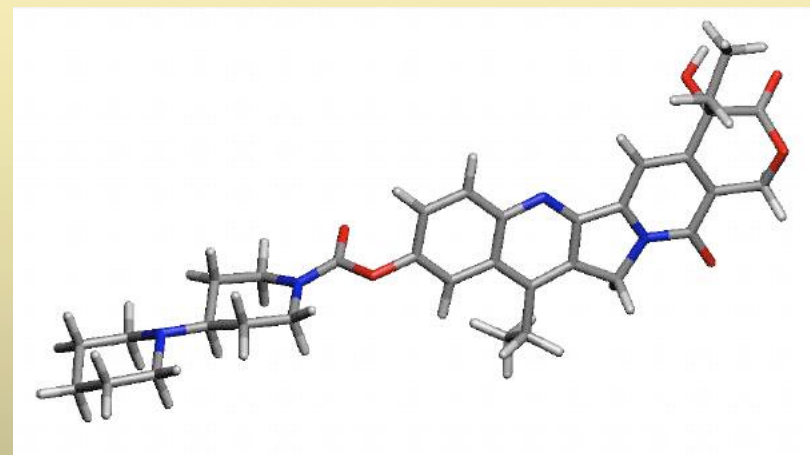
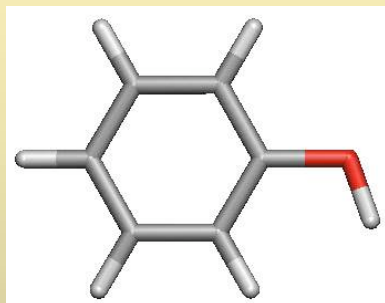
# zh aw — 3. Wädenswiler Chemie-Tag 16. Juni 2011

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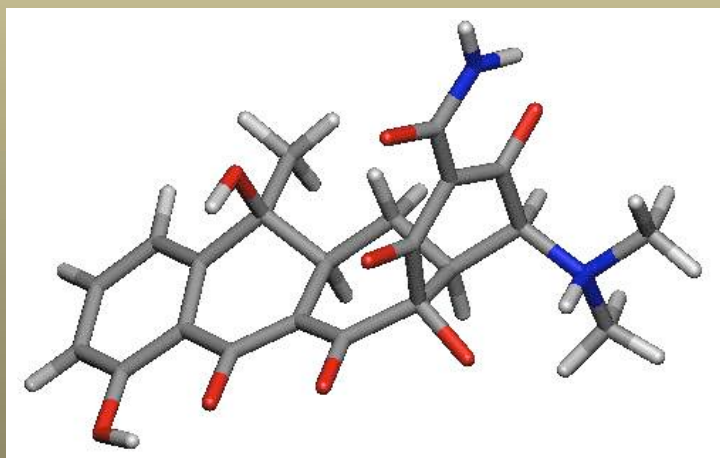
## Limitation: size, protonation state, metabolites



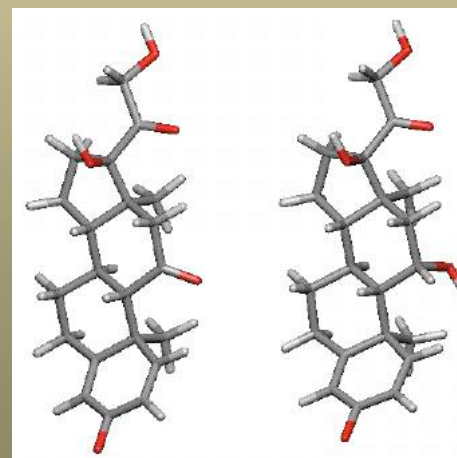
**Too small:** MW < 100: Sampling not exhaustive with the larger target proteins (e.g. hERG, 3A4)



**Too large:** MW > 500: Induced fit may be simulated but not quantified



**Uncertain protonation state:** Protonation state in binding pocket may be different from aqueous solution

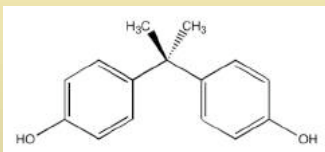


**Metabolites:** Parent compound (left) and active metabolite (right)



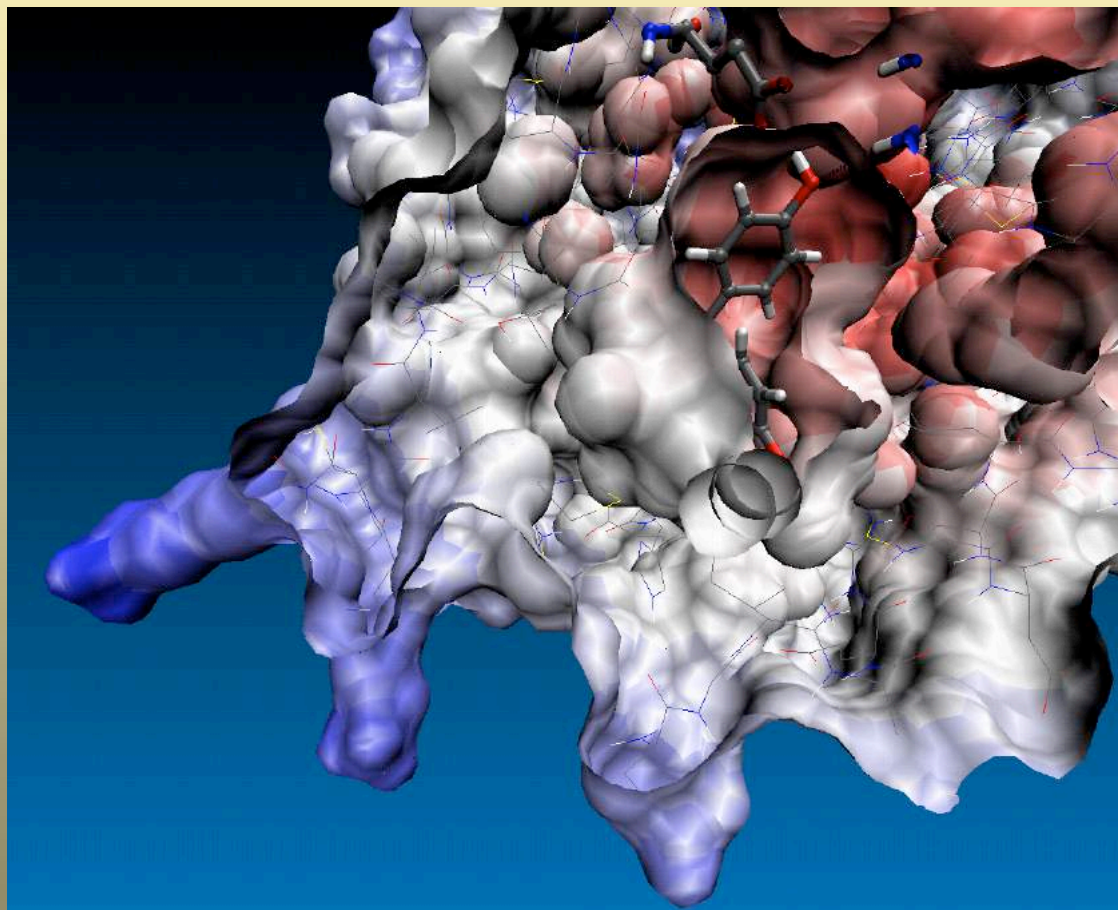
## Affinity profiling

### Bisphenol A (plasticizer)



AR: 48.8  $\mu\text{M}$   
AhR: not binding  
ER $\alpha$ : 47.4  $\mu\text{M}$   
**ER $\beta$ : 177 nM**  
GR: >2.5  $\mu\text{M}$   
LXR: >3.3  $\mu\text{M}$   
MR: >700 nM  
PPAR $\gamma$ : >2.0  $\mu\text{M}$   
TR $\alpha$ : not binding  
TR $\beta$ : > 12 $\mu\text{M}$   
hERG: 18.5  $\mu\text{M}$   
CYP1A2: 1.14 mM  
CYP2A13: 35.5  $\mu\text{M}$   
CYP2C9: 177  $\mu\text{M}$   
CYP2D6: > 190  $\mu\text{M}$   
CYP3A4: 398  $\mu\text{M}$

**Toxic potential = 0.459**



### Screening of environmental chemicals

**Toxic potential:**

Benzo[a]anthracene = 0.665

Benzo[a]pyrene = 0.690

Methylbenzylidene camphor = 0.393

Bisphenol A = 0.459

Bibenzo[ah]anthracene = 0.778

Dibenzoxazinylnaphtalene = 0.721

Dipiperazinylnaphtalene = 0.732

Galaxolide = 0.509

Hexachlorodibenzofuran = 0.734

TCDD = 0.740

17 $\beta$ -Estradiol = 0.691

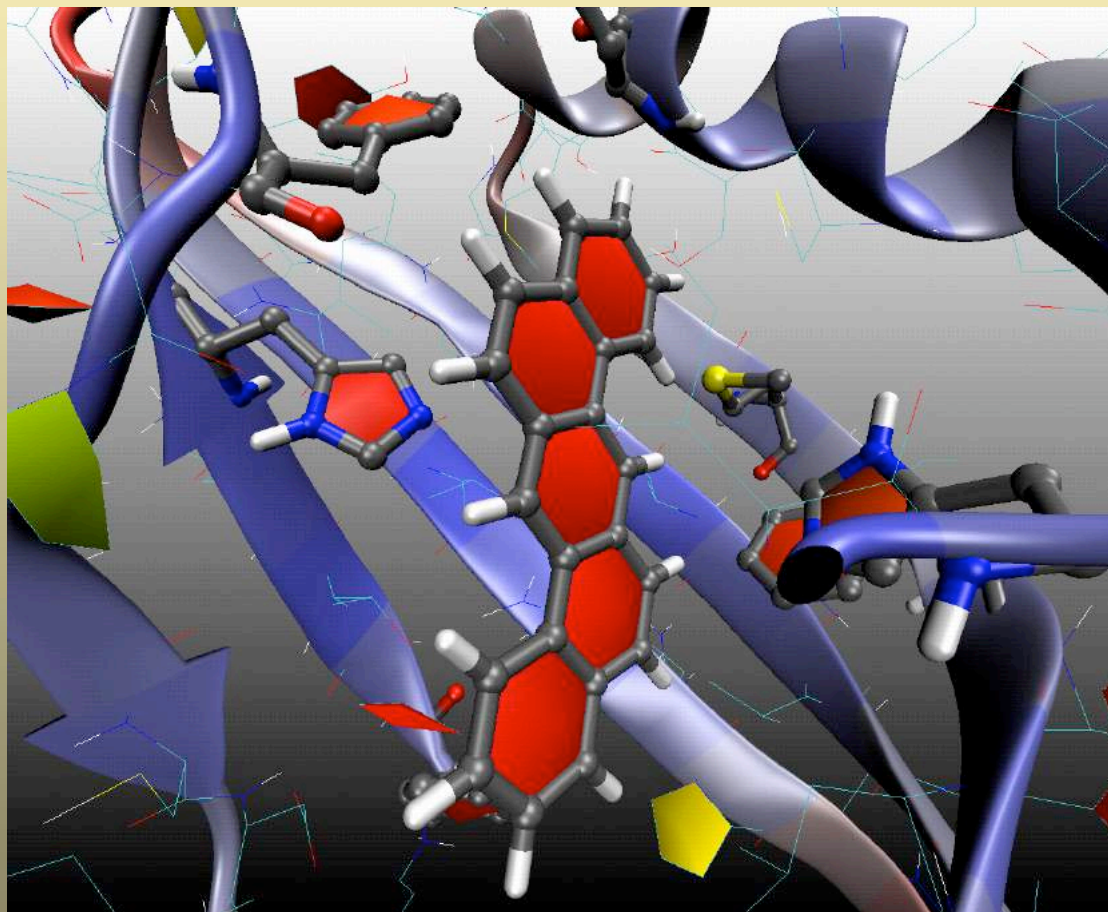
2-Trifluoro-TCDD = 0.735

Coronene = 0.720

OCDD = 0.783

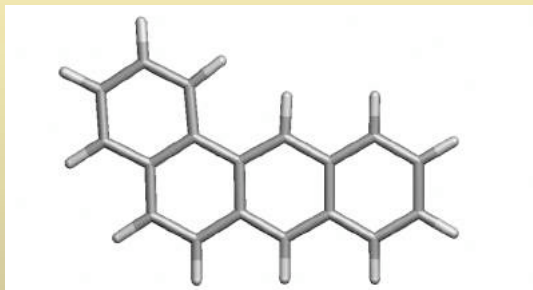
Picene = 0.794

Tetracene = 0.724



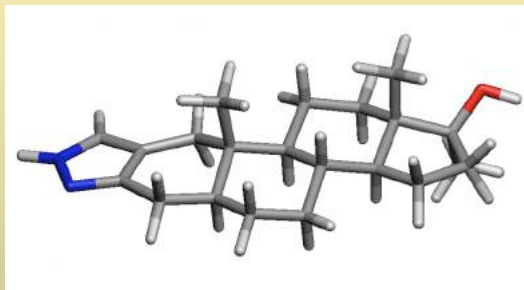
### Performance and Availability

Small, rigid compound



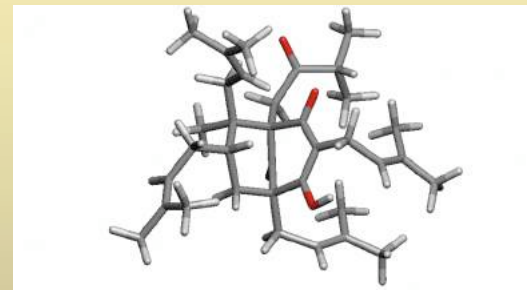
Example: Benzo[a]anthracene  
ToxPot = 0.665, cpu time = 6 h

Medium size/flexible compound



Example: Stanozolol  
ToxPot = 0.815, cpu time = 10 h


Large, flexible compound



Example: Hyperforin  
ToxPot = 0.242, cpu time = 36 h

- Low throughput technology (15–20 compounds/day on a 3.0 GHz 8-processor CPU)
- Freely available for non-profit oriented organizations: OpenVirtualToxLab™
- Release includes graphical-user interface, 3D viewer and model builder
- Interface runs on all platforms (Macintosh, Linux, Unix, Windows); secure SSH protocol
- Currently 128 dedicated processor cores (total peak performance =  $2 \times 10^{12}$  FLOPS = 2 TFLOPS)
- Documentation and application on-line: <http://www.virtualtoxlab.org>

## Summary

- **Simulation and quantification of small-molecule binding to 16 target proteins:** AR, AhR, CYP 1A2, CYP2A13, CYP2C9, CYP2D6, CYP3A4, ER $\alpha$ , ER $\beta$ , GR, hERG, LXR, MR, PPAR $\gamma$ , TR $\alpha$ , TR $\beta$
- Mixed-model approach: automated, flexible docking + mQSAR (induced fit, solvation, entropy)
- **Toxic potential + individual binding affinities**
- **3D structure of ligand–protein complex;** real-time visualization
- 20+ publications (*J.Med.Chem*, *ChemMedChem*, *Mol.Inf.*, *Tox.Let.*, *ALTEX*, *ATLA*, *Pharmacol.Toxicol.*)
- **2,500+ compounds tested**  <http://www.virtualtoxlab.org>
- **Fully automated technology**, secure SSH protocol, all computer platforms (Mac, Linux, Windows)
- Free for non-profit organizations: OpenVirtualToxLab™

 <http://www.virtualtoxlab.org>