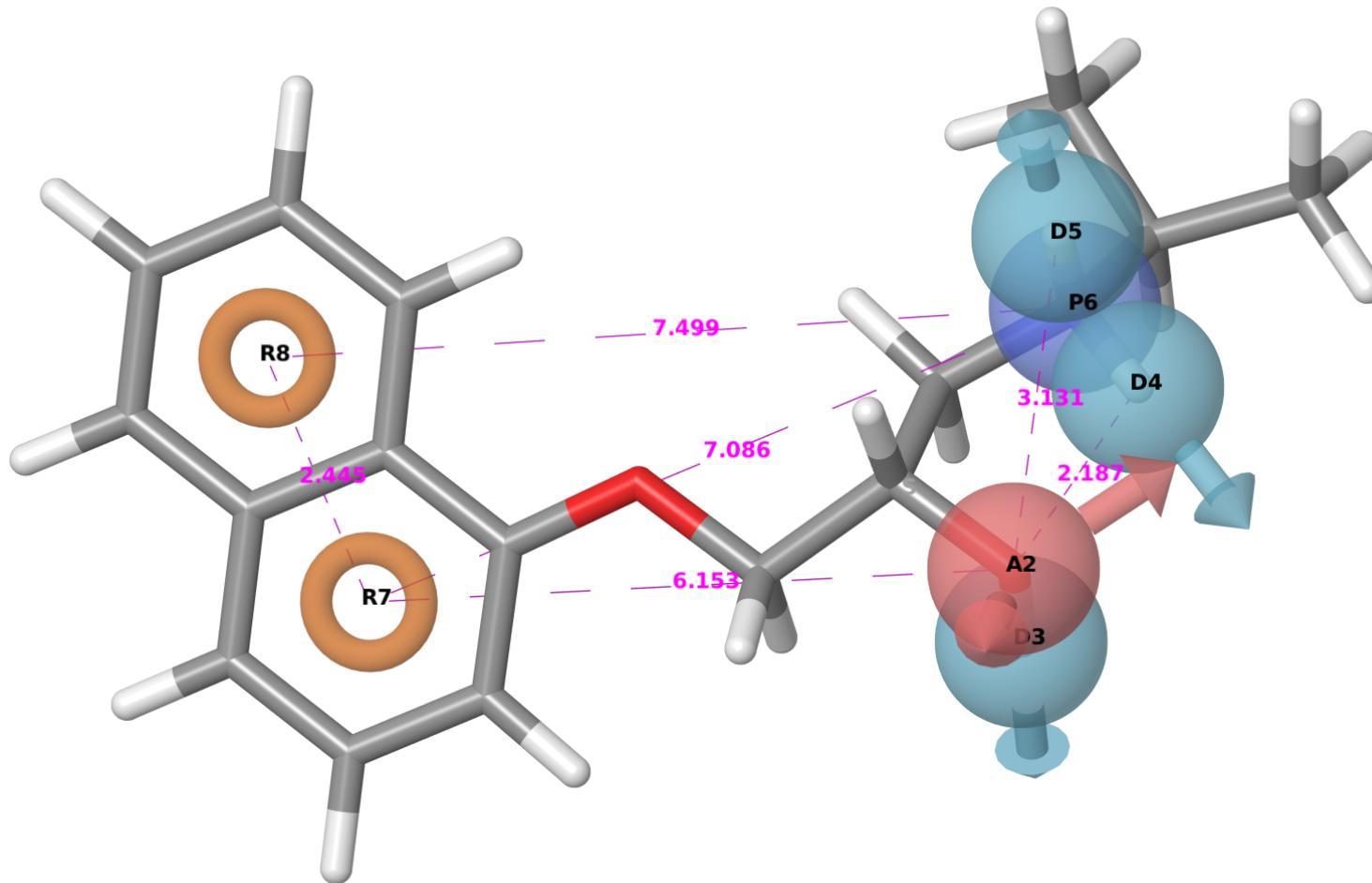




# Ligand-Based Design





# What is Ligand-Based Design?

Traditional approach in the Computer-Aided Drug Design applied especially in the era before protein crystallography (→ structure based design), **more than 50%** of current FDA-approved drugs were optimized by (some technique related to) LBD\*

## Applicability domain

- 3D structure of the receptor is unknown (e.g. membrane anchored proteins, receptors or ion channels composed of multiple subunits, problematic expression and purification)
- known hit(s) from screening of compounds from natural extracts or synthetic libraries

## Examples of drugs designed by LBD:

- antidepressants and most of psychopharmaca (G-protein coupled receptors, ion channels)
- ACE inhibitors (membrane-anchored enzyme) → case study
- local anesthetics (ion-channel)

\*Shim J., MacKerell A.D., Jr.: Computational ligand-based rational design: role of conformational sampling and force fields in model development. *Med. Chem. Commun.* (2011) 2, 356.



# Theory behind LBD

## Ligand-receptor complementarity

arrangement of functional groups of affine ligands is complementary to the arrangement of the functional groups in receptor (*lock & key, induced fit, conformational selection, population shift*)

## Internal strain

biologically active molecules (ligands) bind with their macromolecular counterpart (receptor) in a conformation energetically not too far from the global minimum, i.e. in a conformation with low internal strain

## Pharmacophore

based on a superposition (alignment) of the low energy conformers (identified in a conformational search) of a single or several compounds a common pharmacophore can be derived

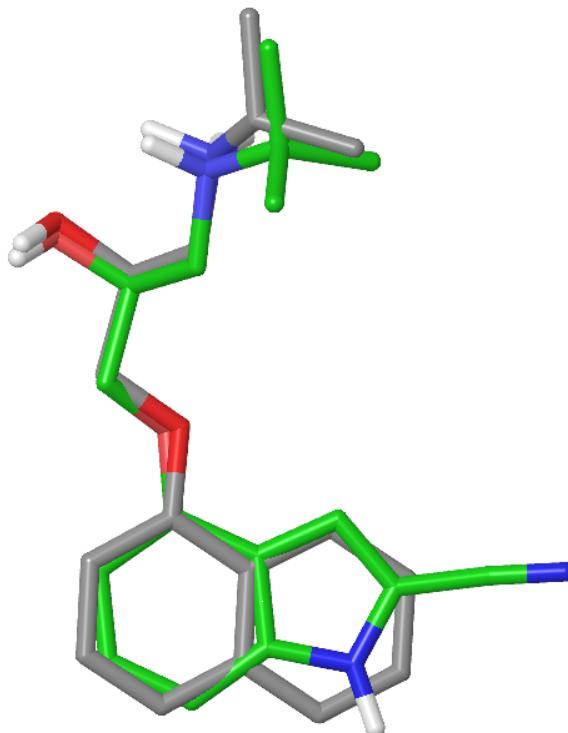
## Similarity

ligands with a similar structure bind to receptor in a similar mode (no multiple binding modes)

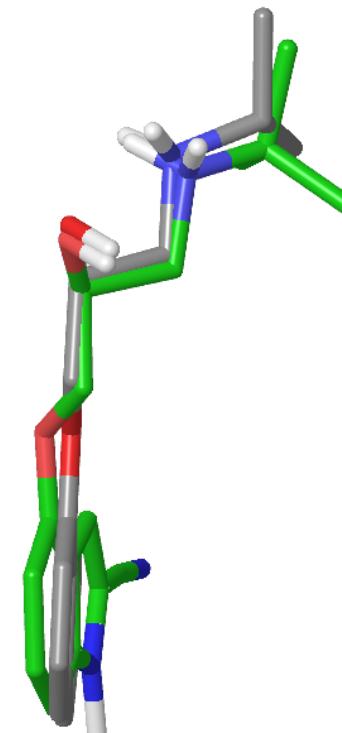


## Internal strain – a real-world example

Superposition of the bioactive conformation of Cyanopindolol (green carbon atoms, PDB ID: 2VT4) at  $\beta_1$ -receptor and low-energy conformer of Propranolol (grey carbon atoms) identified in conformational search using the OPLS2005 force-field in water;  $\Delta E$  vs. glob.min. = 0.89 kcal/mol



TOP VIEW



SIDE VIEW



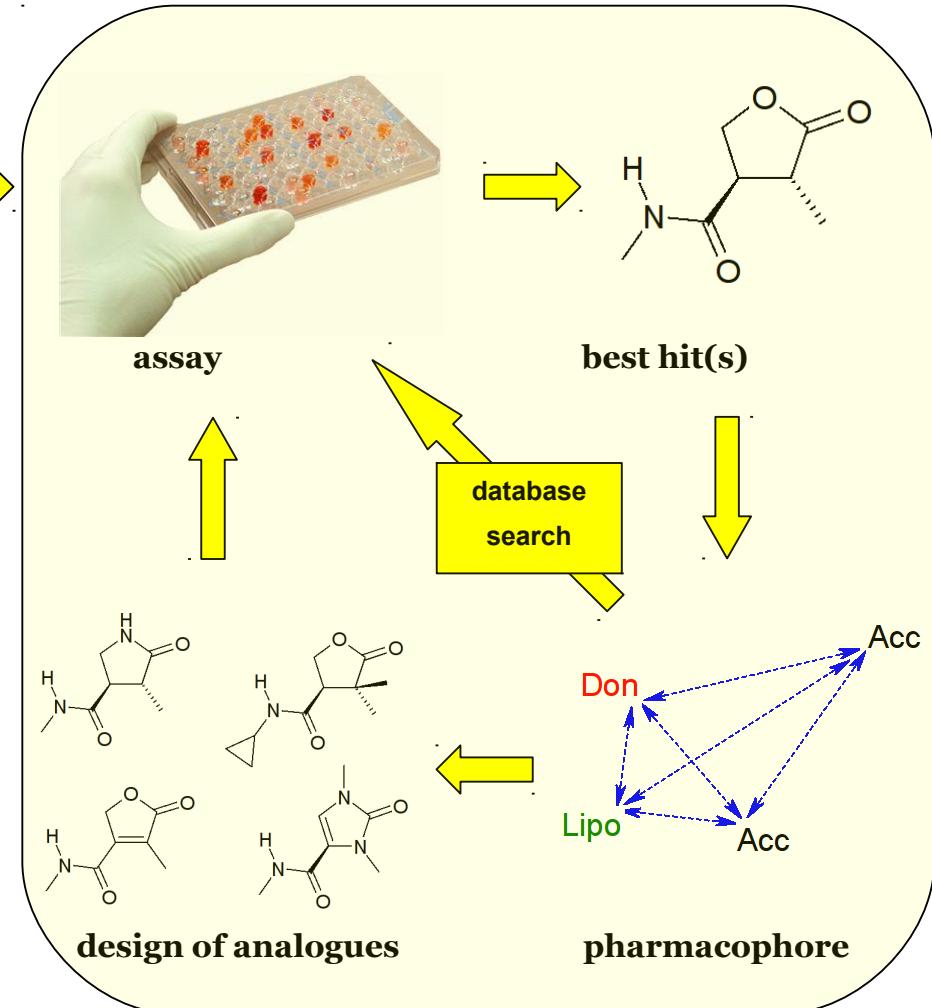
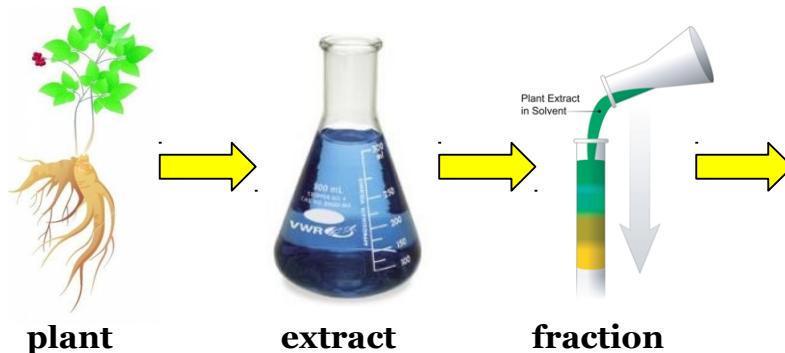
# What do we need for a successful LBD?

In LBD the ligands are the only source of data and many molecular descriptors are calculated in order to rationalize scoring and selection ( $pK_a$ , polar surface area, molecular weight, etc.)

- a **greater number** of chemical compounds (usually in later stages of development)
- **diverse scaffolds** help to restrict conformational space
- some **rigid** or at least **conformationally limited** compounds
- active as well as **inactive** molecules, large **range of activities**
- some **directional properties** (e.g. H-bond extension vectors, lone pair vectors, ring planes)
- know **protonation state** at the site of action
- advanced molecular modeling software to perform **conformational search, superimpose conformers** (alignment), build **pharmacophore** and calculate **score**



# LBD - Schematic overview



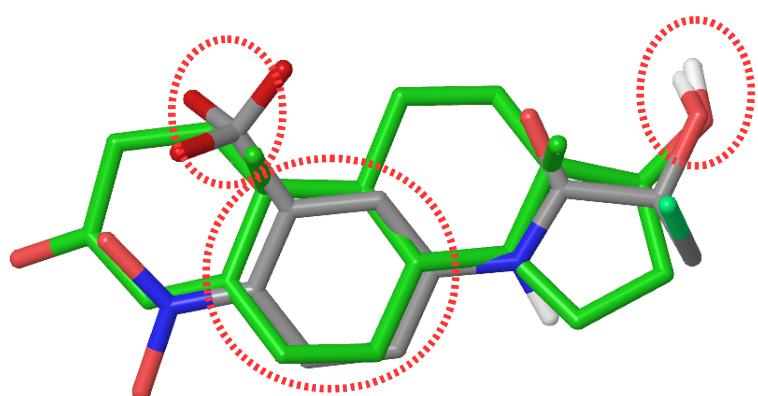


# Alignment

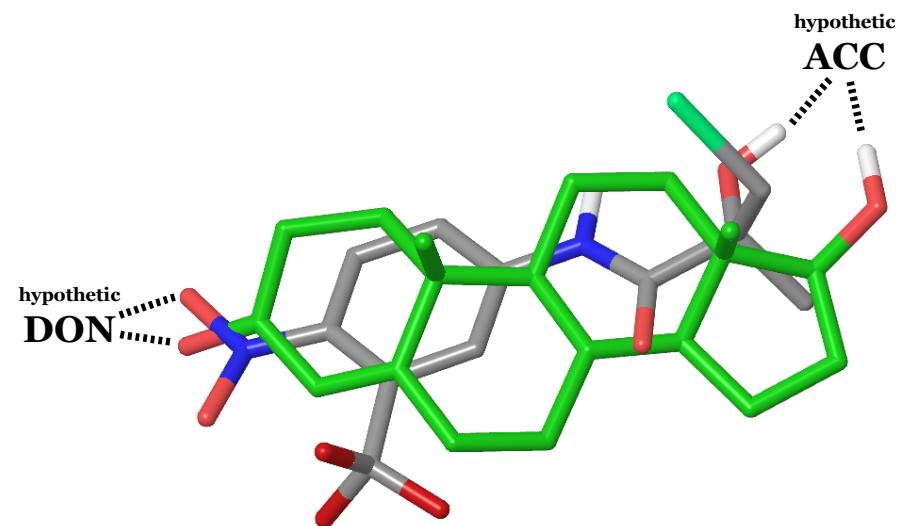
**Good Alignment → Good Pharmacophore**

Molecular alignment – finding the best overlap between multiple molecules (conformers)

atom-based, property-based (e.g. electrostatic potential, field based), hypothetic partner-based...



**Functional group-based alignment**



**Hypothetic partner-based alignment**



# Alignment

**Good Alignment → Good Pharmacophore**

## Advanced mathematical algorithms

Flexible alignment – simultaneous minimization of strain and fit to a specified template or pharmacophore; Weighted alignment – pairs have unequal importance (weight)

The most simple measure of goodness of fit is the ***Root Mean Square Deviation (RMSD)***:

$$\text{RMSD} = \sqrt{\frac{1}{N} \sum_{i=1}^N \delta_i^2} \quad , \text{ where } N \text{ is number of pairs, } \delta \text{ is distance between two points}$$

**Interaction energy-based scoring methods** → QSAR models (receptor surrogate), Comparative Molecular Field Analysis (CoMFA), Comparative Molecular Similarity Indices Analysis (CoMSIA)

**Special scoring methods** → Hologram QSAR (fragments), GRIND (does not need alignment, grid-based), VolSurf (3D voxels – shape, electro, volume → compressed to 2D descriptors)...



# Pharmacophore

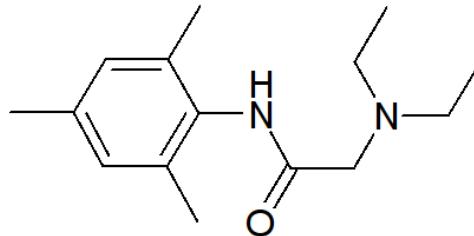
**IUPAC definition:** “The ensemble of steric and electronic features that is necessary to ensure the optimal supramolecular interaction with a specific biological target structure and to trigger (or block) its biological response”

**The most active** (sometimes the most rigid compound) is usually taken as a **template** from which initial pharmacophore is derived. In the course of the study the pharmacophore is further refined.

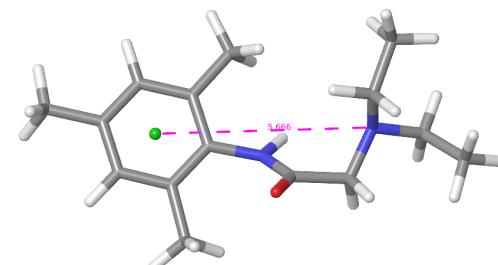
## Various levels of abstraction for representing molecules

Descriptional → *arom. ring linked by a heteroatom and two carbon atoms to a tertiary amine...*

1-dimensional → e.g. SMILES code: CCN(CC)CC(=O)Nc1ccccc1



2-dimensional → e.g. 2D formula

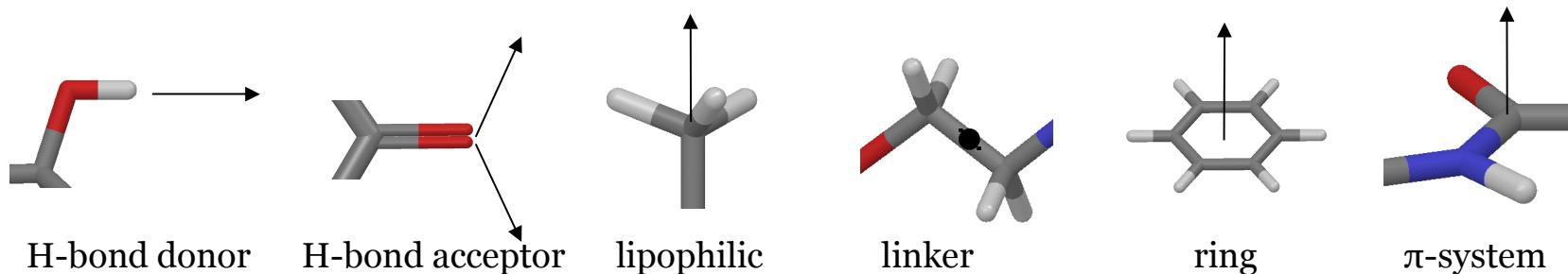


3-dimensional → e.g. 3D conformation



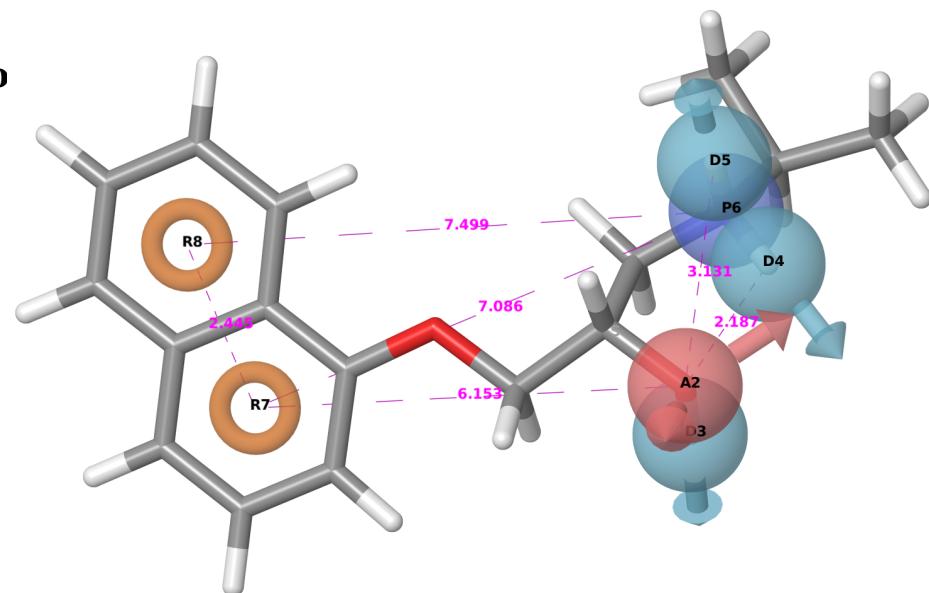
# Pharmacophore features

Typical molecular features (functional groups) recognized by modeling software



## Extended pharmacophore representation

- Information about forbidden zones
- Directional properties like:  
extension vectors, ring normals,  $\pi$ -systems
- Angles, dihedral angles between properties
- Others, depending on which properties are supported by the database to be searched





# Database Searching – Novel Scaffolds

The better the search query, the better the results :)

## Similarity searches using

- Pharmacophore - certain form of pharmacophore is used to identify similar molecules
- Fingerprint – combination of various properties (descriptors)

## Most popular freely accessible databases

- PubChem - <http://pubchem.ncbi.nlm.nih.gov/>
- ZINC Database - <http://zinc.docking.org/>
- ChEMBL - <https://www.ebi.ac.uk/chembl/>
- eMolecules - <http://www.emolecules.com/>
- Relibase (search within data stored at the Protein Data Bank) - <http://relibase.ccdc.cam.ac.uk/>

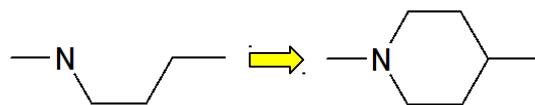
## Non-free

- Cambridge Crystallographic Data Bank (CSD) - [www.ccdc.cam.ac.uk](http://www.ccdc.cam.ac.uk)
- commercial libraries (pharma companies)



# Ligand Optimization Techniques in LBD

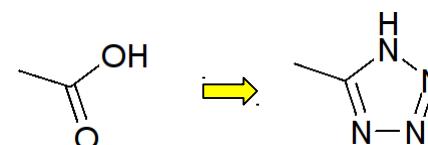
- rigidification



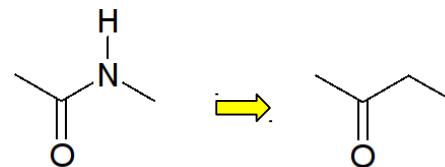
- optimizing electronic distribution



- isosteric & isoelectronic replacements



- replacing scissile bonds



- removing chirality (synthesis is usually easier without chiral centers), if it does not worsen selectivity
- exploring new existence of new pockets/interactions by extending ligand and substitutions

All of the above must be done while **monitoring or actively co-optimizing ADMET properties**  
and checking **compatibility with the pharmacophore**



# Ligand Based Design - Conclusion

## Advantages

- no need to know 3D structure of target
- can produce drug candidates comparable to structure-based design

## Disadvantages

- need of a higher number of synthesized and tested compounds (systematic structural changes)
- compared to structure-based design: the solvation pattern of the binding site is unknown → cannot improve binding by displacing water; interacting partners on target macromolecule not known → are assumed protonation states correct?

## Prerequisites

- a classical target (constant, small or negligible induced fit)
- good conformational search algorithm, force-field parameters, alignment protocol, scoring function

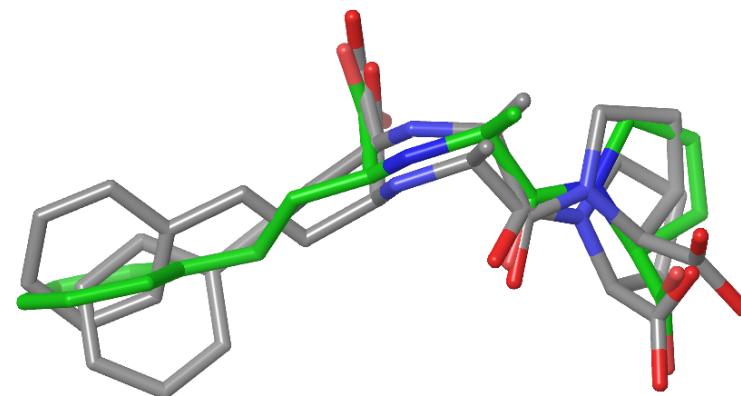
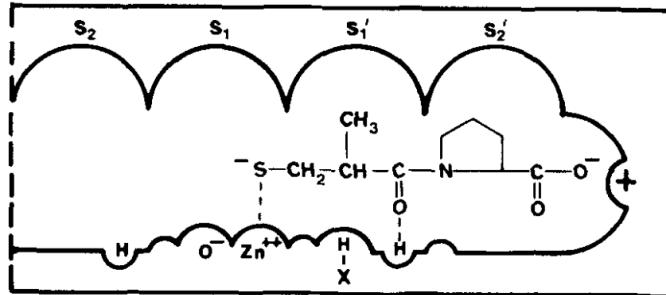
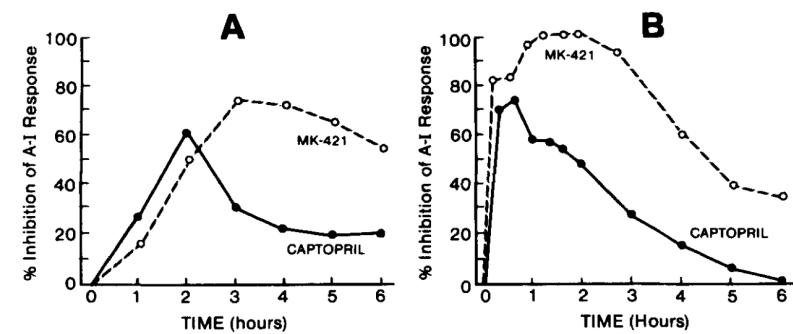
## Might fail if

- big conformational changes at receptor site, depending on the ligand
- multiple binding modes
- internal strain needed for proper ligand accommodation higher than assumed



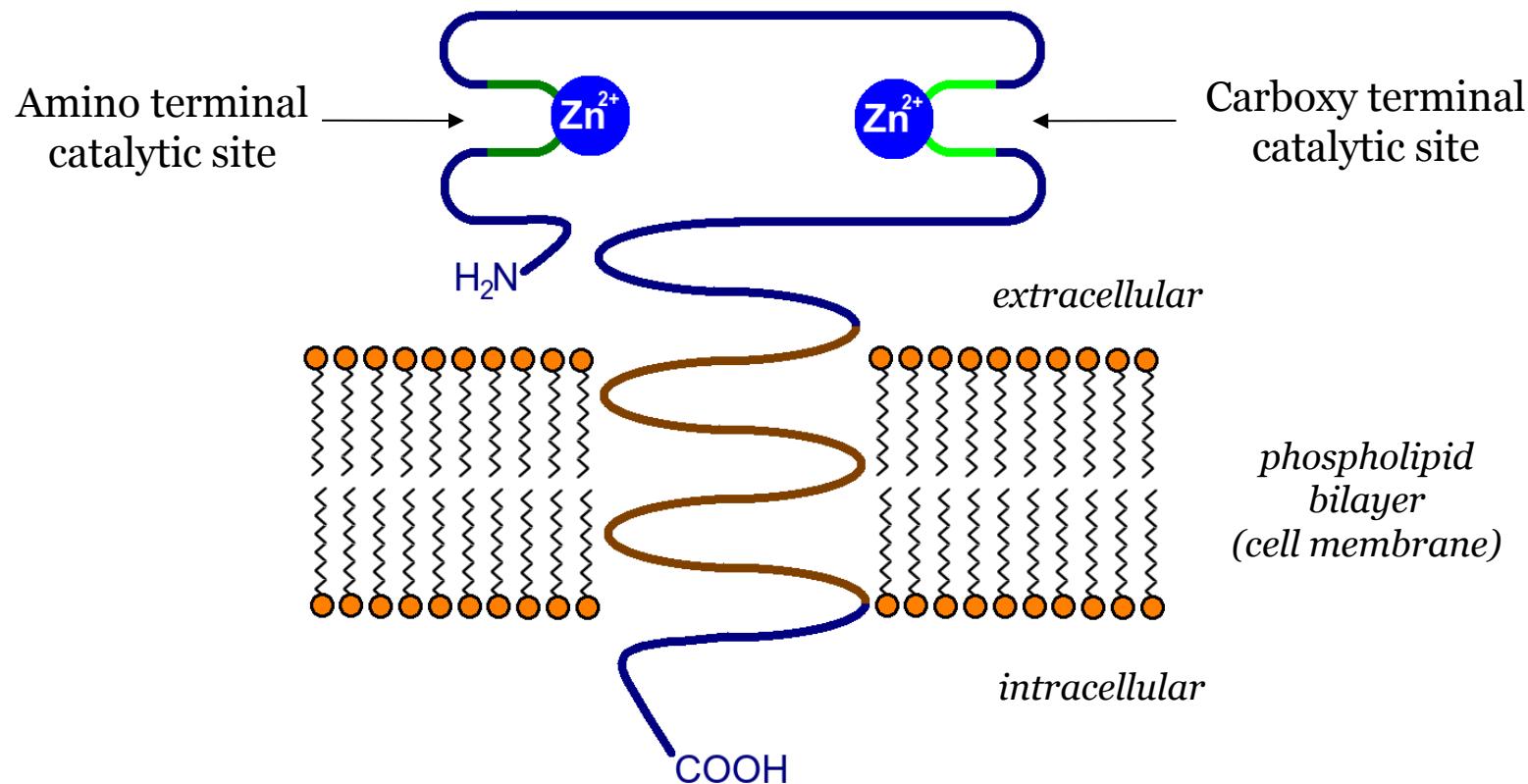
# Ligand-Based Design – Case Study

## Angiotensin-Converting Enzyme Inhibitors





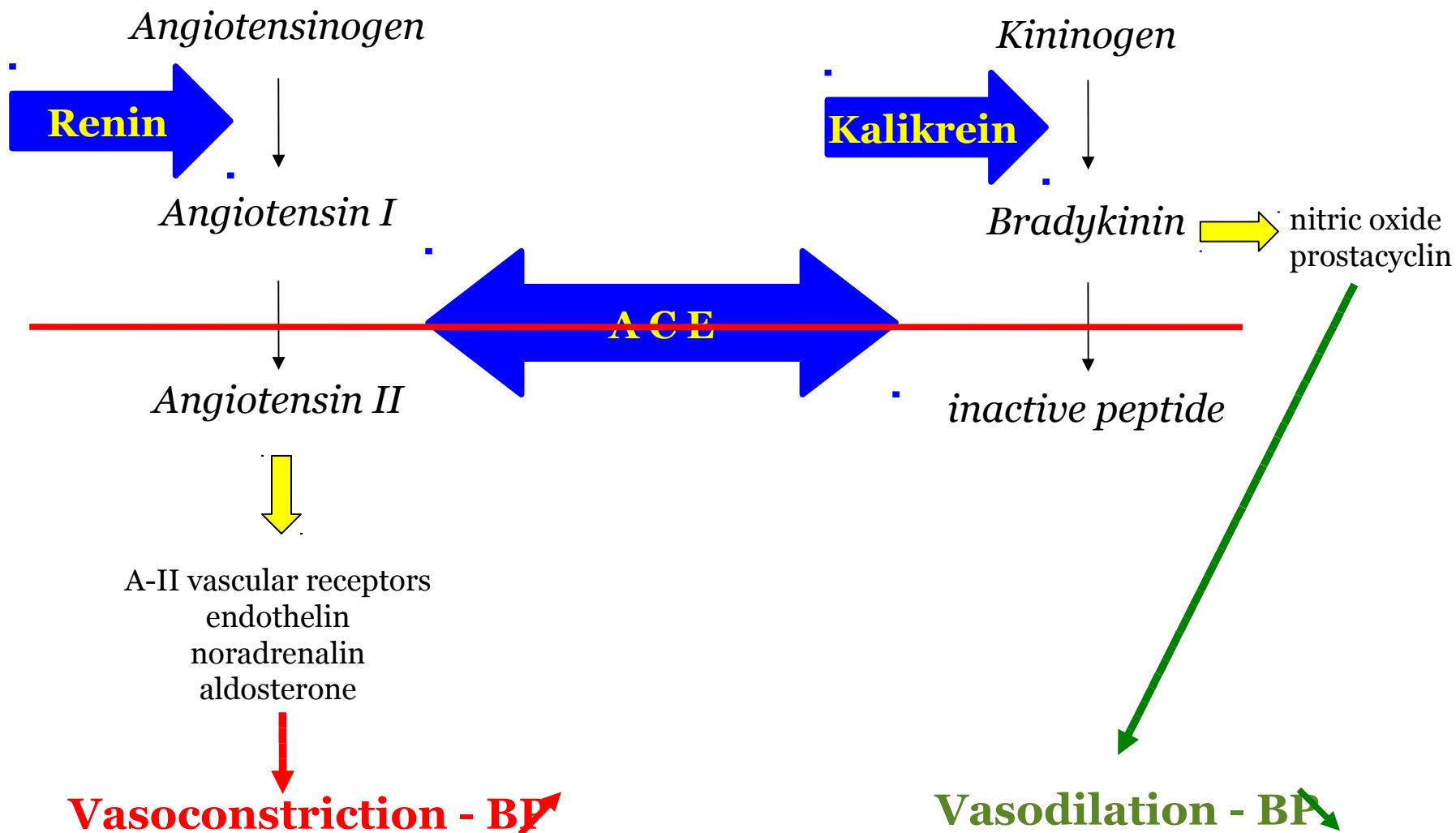
# Ligand-Based Design – Case Study



Structure of ACE C-domain was elucidated as late as in 2003.

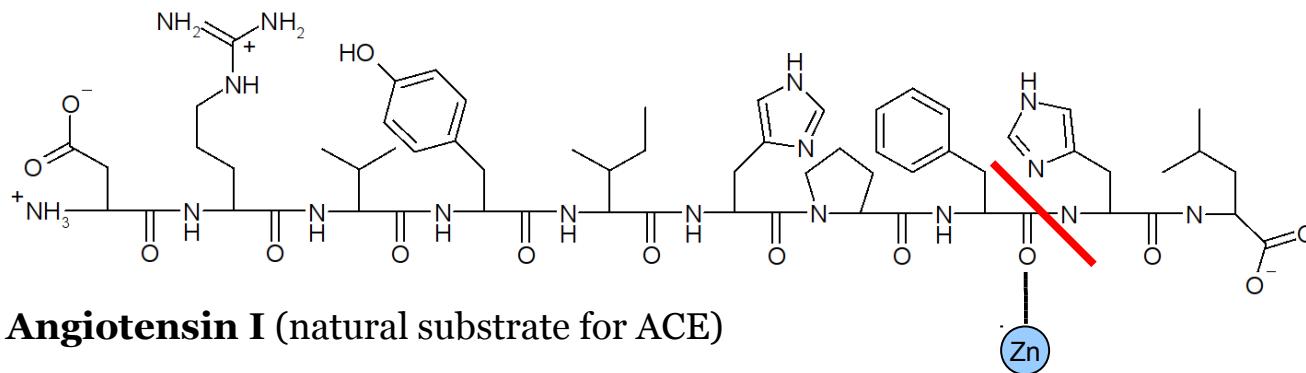


# ACE in the Renin-Angiotensin-Aldosterone System





# Discovery of Teprotide

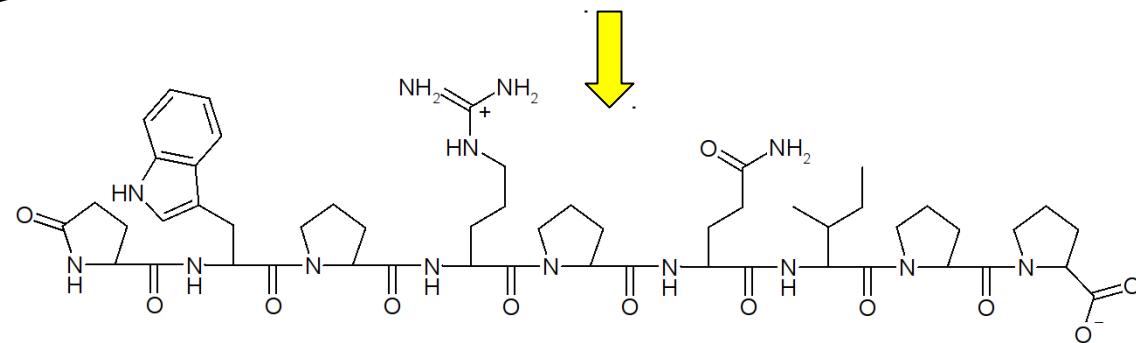


**Angiotensin I** (natural substrate for ACE)



**Snake venom** (bradykinin “potentiating” effect)

S. H. Ferreira, et al., Biochemistry, 9, 2583 (1970).



*Bothrops jararaca*

**Teprotide** (active compound) – the first peptidic ACE inhibitor

M. A. Ondetti, et al., Biochemistry, 10, 4033 (1971).



# Ligand Based Design of ACE inhibitors

based on

## Angiotensin-Converting Enzyme Inhibitors: Medicinal Chemistry and Biological Actions

Medicinal Research Reviews, Vol. 2, No. 1, 1-41 (1982)

+

## Recent Developments in the Design of Angiotensin-Converting Enzyme Inhibitors

Medicinal Research Reviews, Vol. 5, No. 4, 483-531 (1985)

+ additional literature > 1985

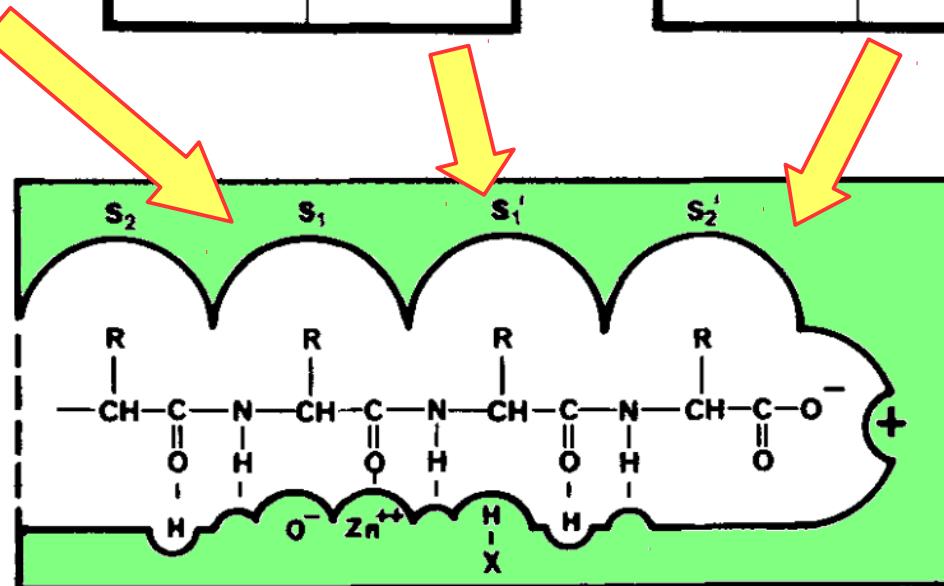


# Mapping binding site using peptides

S <sub>1</sub> Subsite	
Hip-X-His-Leu	X K <sub>i</sub>
Arg	0.4
Phe	0.8
Pro	1.2
Ala	1.3
Ile	1.6
Ser	1.8
Glu	4.5
D-Phe	1.5

S <sub>1'</sub> Subsite	
Hip-X-Leu	X-Gly <sup>I50</sup>
Pro	0.14
Arg	0.77
His	*
Ala	1.8
Phe	1.9
Glu	4.0
Val	1100
Arg	1200
Ala	2500
Lys	3200
Phe	3700
His	6300
Gly	7200
Leu	8800
Glu	10000
Pro	17000

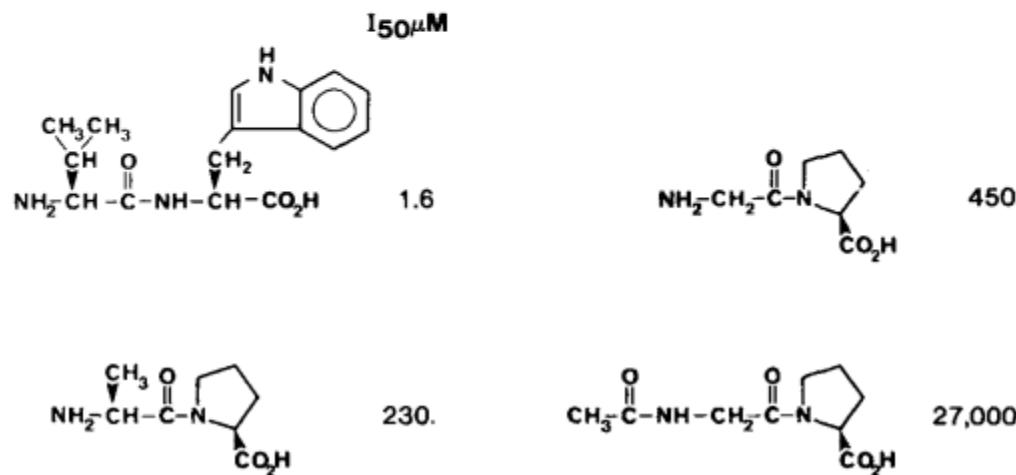
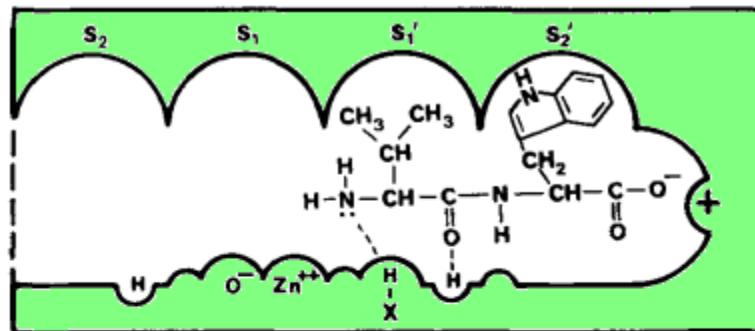
S <sub>2'</sub> Subsite			
Hip-His-X	Gly-X <sup>I50</sup>	HSCH <sub>2</sub> CH <sub>2</sub> COX <sup>I50</sup>	
Arg	0.08	Trp	30
Pro	0.64	Pro	210
Leu	*	Phe	450
Ala	3.2	Ala	2000
Phe	3.7	Leu	2500
Glu	>50.	Arg	3200
		Lys	5400
		Glu	5400
		Gly	7200
		Asp	9200
		D-Pro	1800.





# Dipeptide Inhibitors **without Zn ligand**

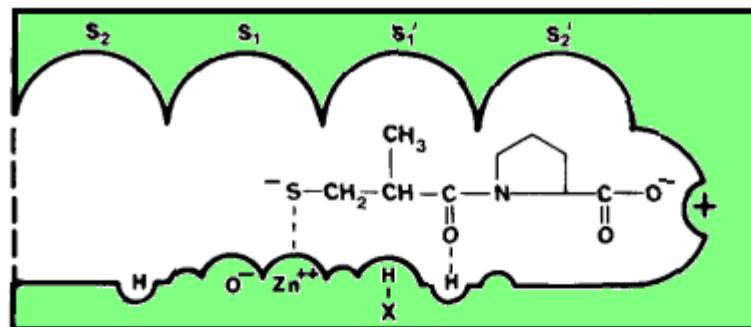
(Combining the best fragments from the peptide scan)





# Dipeptide Inhibitors with Zn ligand

(Inspecting role of the terminal carboxyl by isosteric replacements)

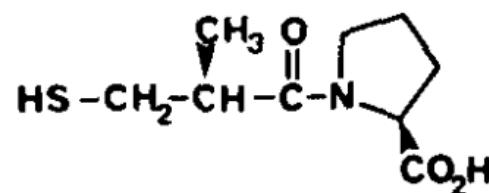


	I <sub>50</sub> μM
<chem>CS(C(=O)N1CCCC1)C(=O)O</chem>	0.023
<chem>CS(C(=O)N1CCCC1)C(=O)[P]O(O)O</chem>	1.7
<chem>CS(C(=O)N1CCCC1)C(=O)C(=O)O</chem>	0.20
<chem>CS(C(=O)N1CCCC1)C(=O)CONHOH</chem>	0.022
<chem>CS(C(=O)N1CCCC1)C(=O)N2CC=NN=C2</chem>	240.
<chem>CS(C(=O)N1CCCC1)C(=O)N2CC=NN=C2</chem>	0.26

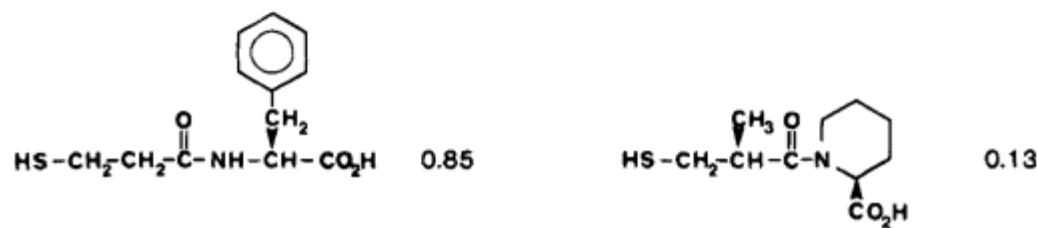
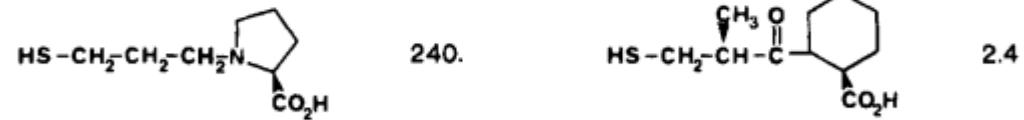
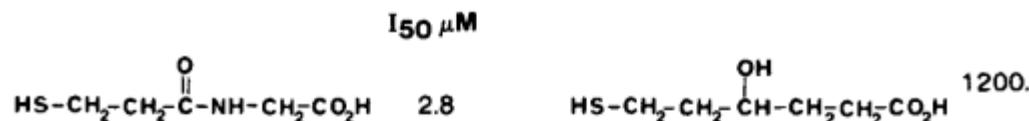


# Dipeptide Inhibitors with Zn ligand

(Searching for the key features – ring size, flexibility, carbonyl)



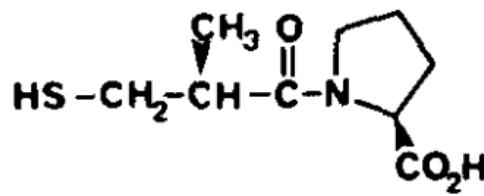
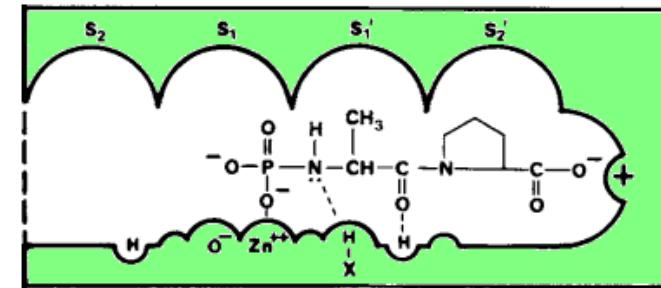
**IC<sub>50</sub> = 0.023 μM**





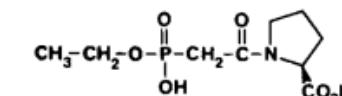
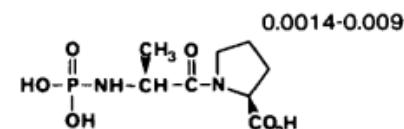
# Dipeptide Inhibitors with Zn ligand

Phosphoric acid-based better than thiols?

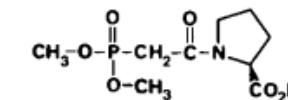
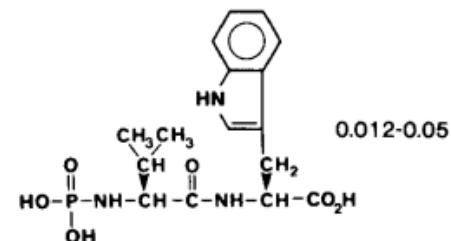


**IC<sub>50</sub> = 0.023 μM**

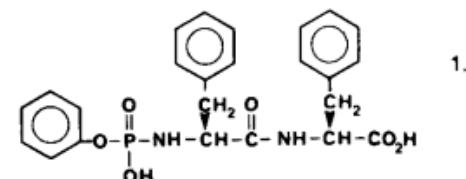
I<sub>50</sub> μM



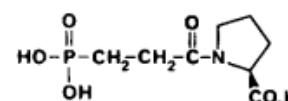
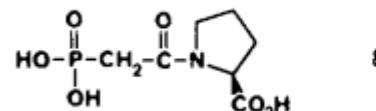
14.



3800.



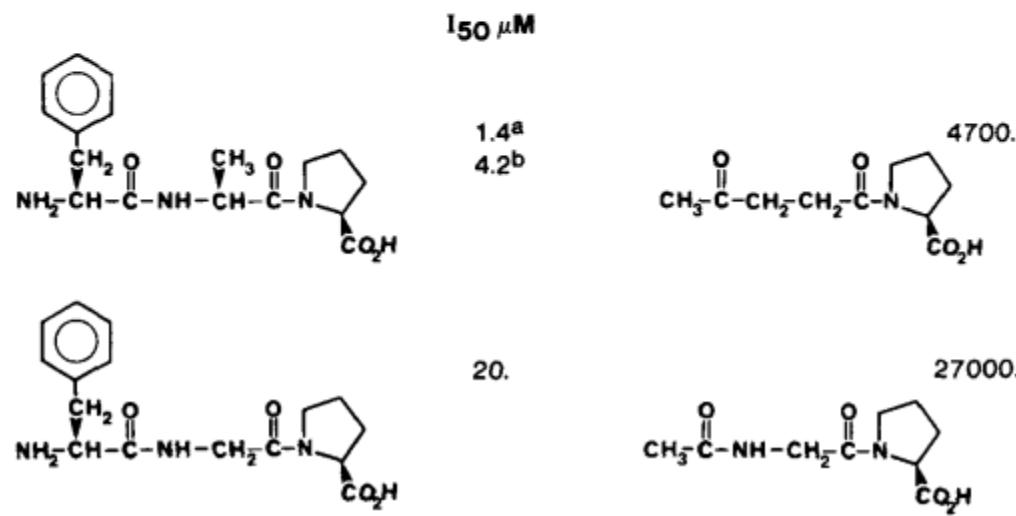
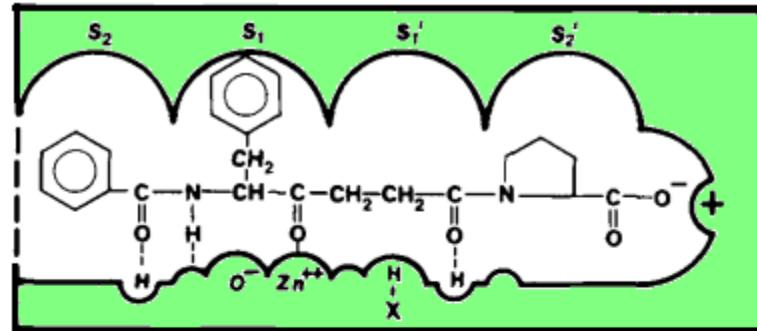
48.



18.

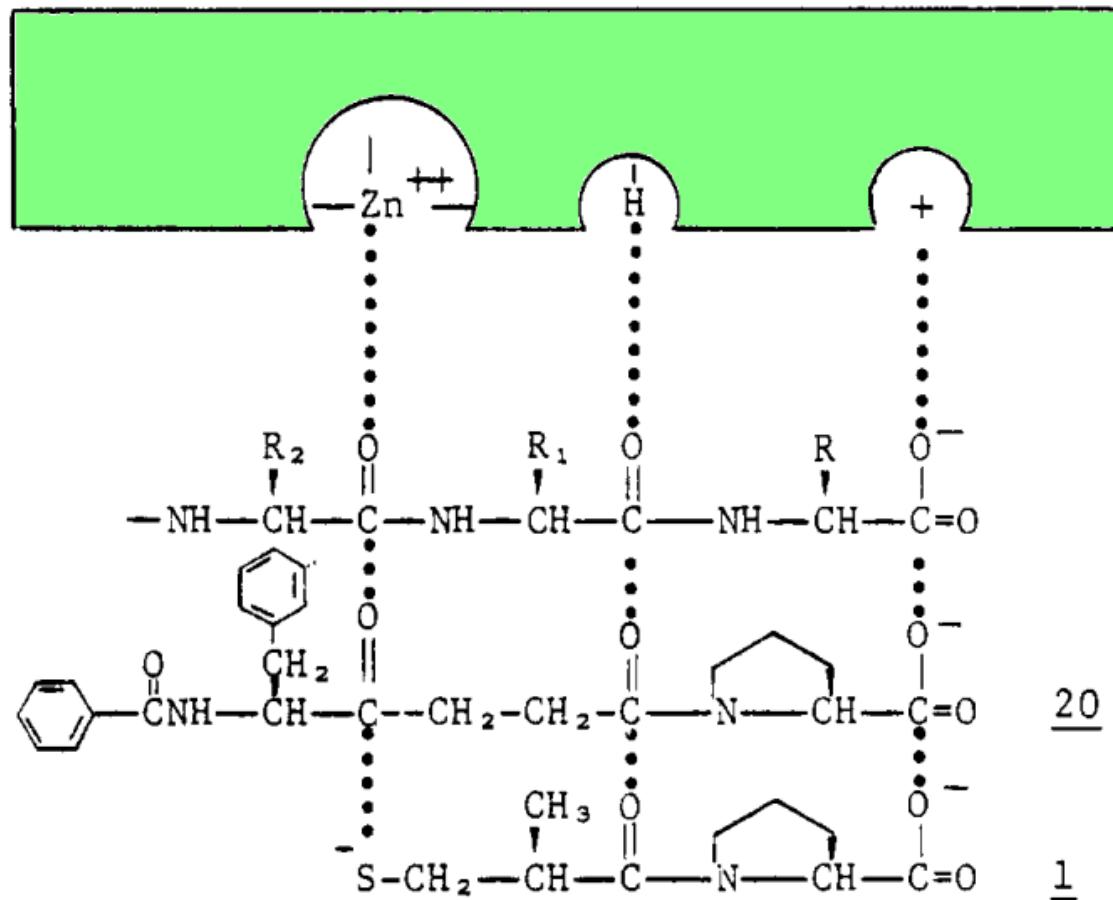


# Tripeptide Inhibitors





# Ketomethylene Tripeptide Analogs

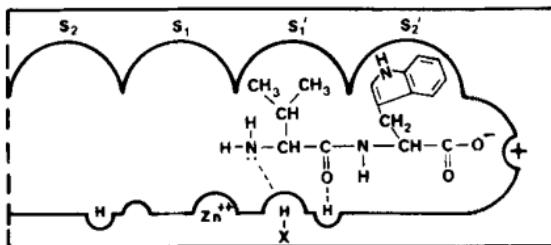


J. Med. Chem. 1980, 23, 1392-1398

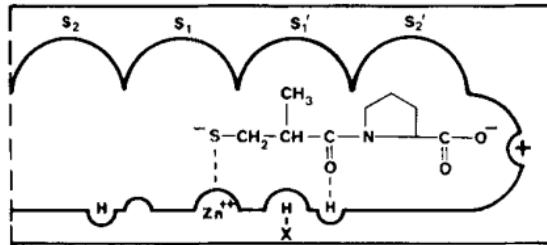


## Overview

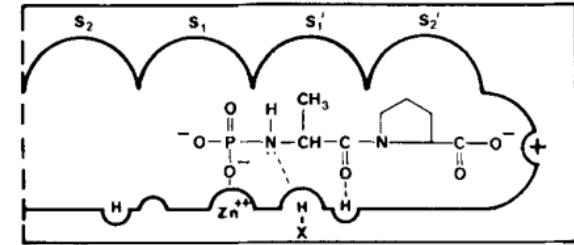
Dipeptide

 $I_{50} \approx 10^{-6}$ 

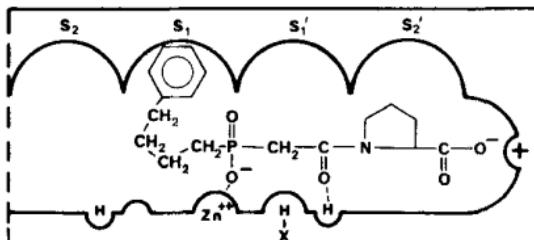
Mercaptoacyl amino acid

 $I_{50} \approx 10^{-8}$ 

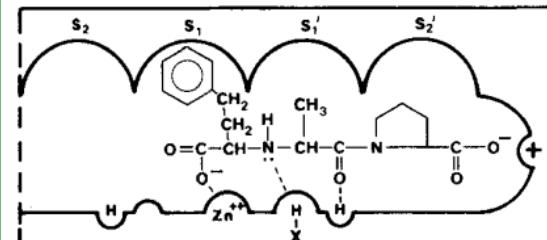
Phosphoryl dipeptide

 $I_{50} \approx 10^{-8}$ 

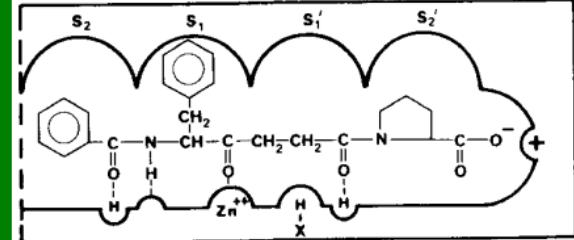
Phosphinic acid

 $I_{50} \approx 10^{-7}$ 

Carboxyalkyl dipeptide

 $I_{50} \approx 10^{-9}$ 

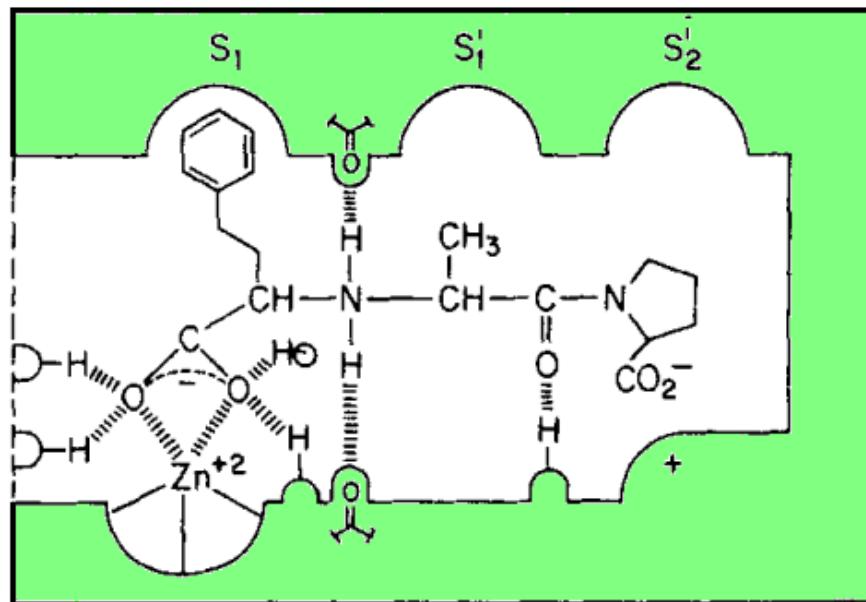
Tripeptide ketone

 $I_{50} \approx 10^{-8}$



# Carboxy alkyl dipeptides

(Searching for the best C-terminal scaffold @ S'₂)

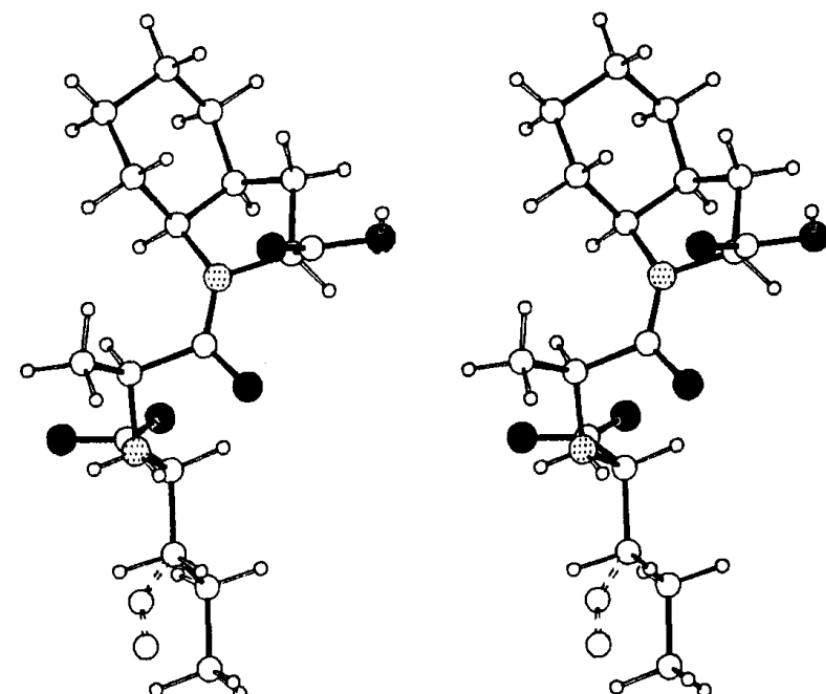
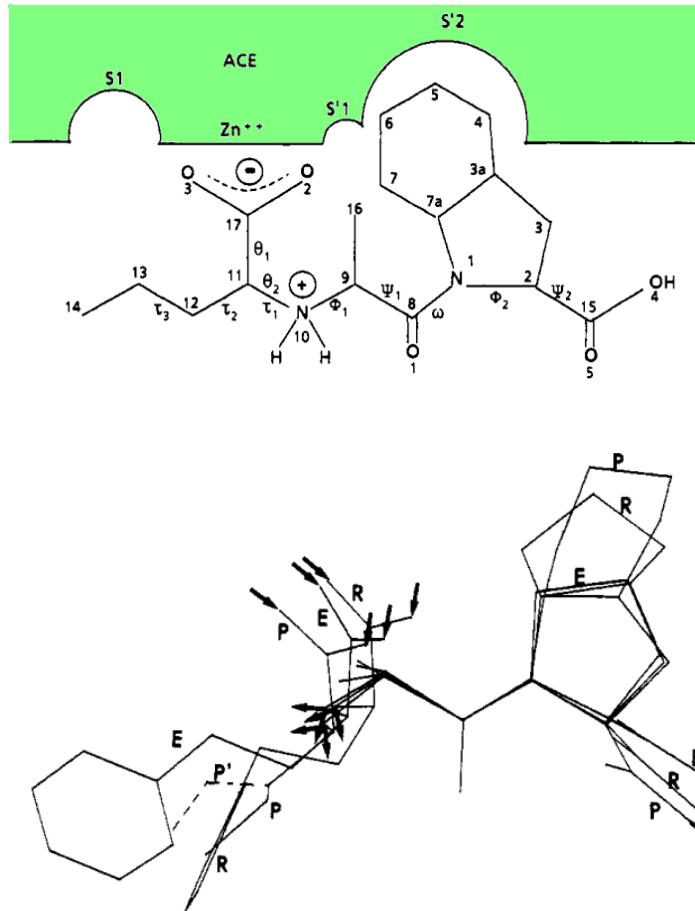


R	I <sub>50</sub> (nM)
<chem>*N1CCCC1C(=O)OCC</chem>	1.2
-OH	>16700 <sup>b</sup>
<chem>*N1CCCC1C(=O)NHC(=O)C2=CC=C(C=C2)OC</chem>	4.2 <sup>d</sup>
<chem>*N1CCCC1C(=O)NHC(=O)C2=CC=C(C=C2)OC</chem>	2.8
<chem>*N1CCCC1C(=O)NHC(=O)C2=CC=C(C=C2)OC</chem>	2.6
<chem>*N1CCCC1C(=O)OCC2=CC=C(C=C2)OC</chem>	40
<chem>*N1CCCC1C(=O)OCC2=CC=C(C=C2)OC</chem>	3.0



1991

# Perindoprilat – moving from 2D to 3D pharmacophore

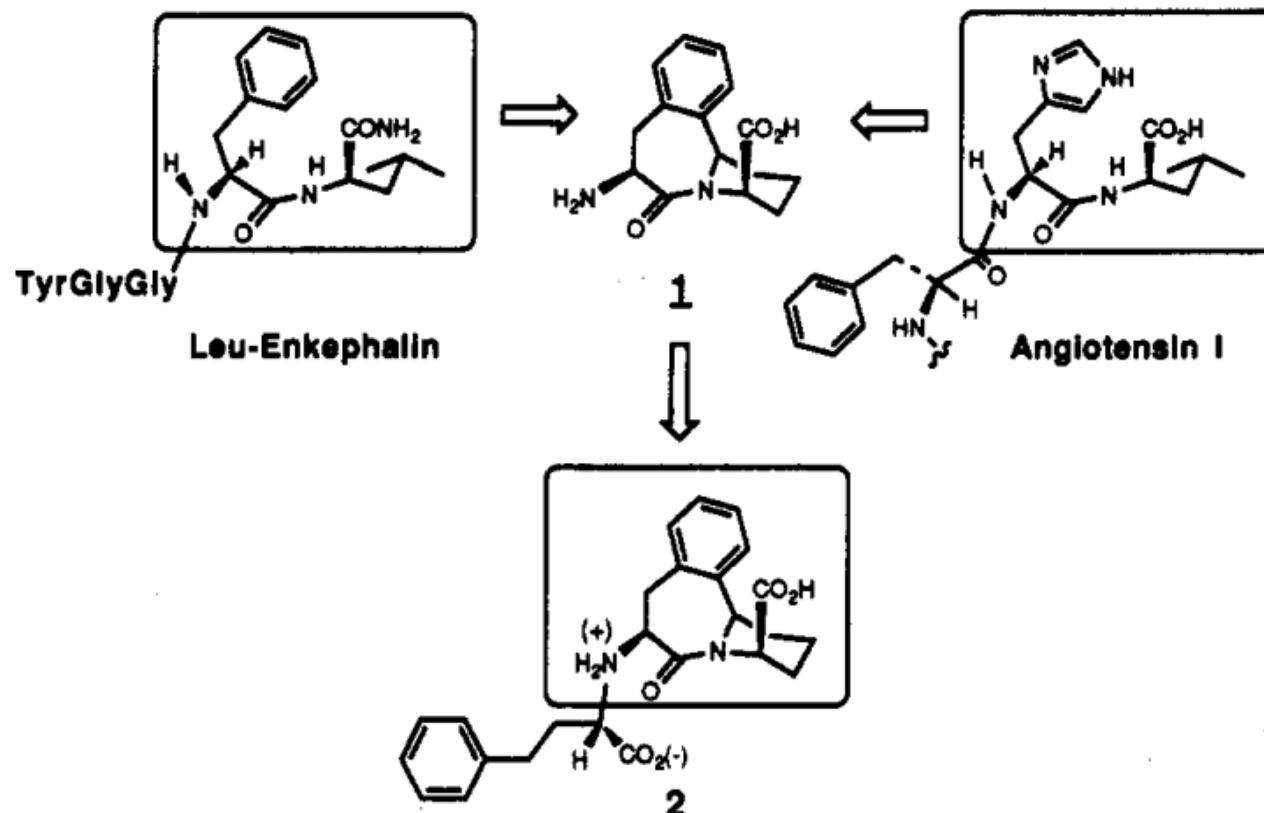


J. Med. Chem. 1991, 34(2), 663



1993

## Conformationally Restricted Phe-Leu Dipeptide Mimetic

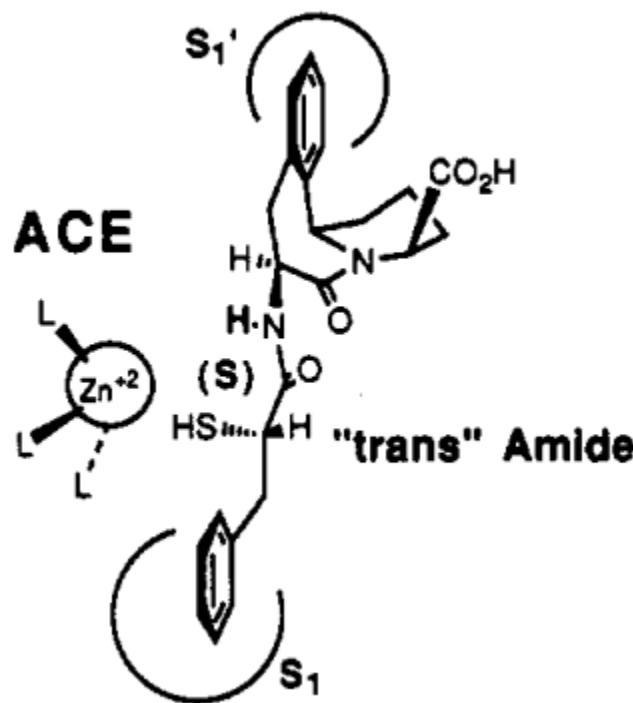


J. Med. Chem. 1993, 36(16), 2420

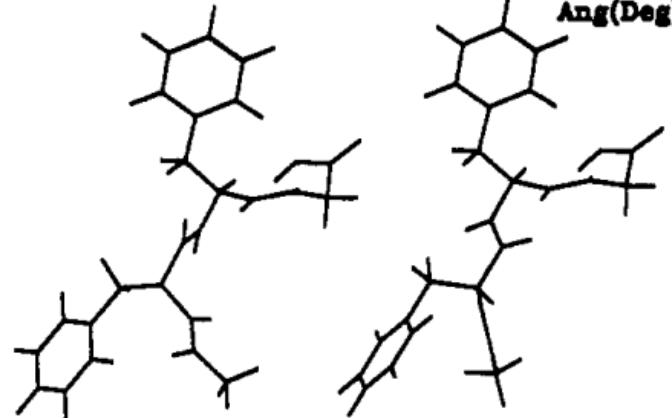
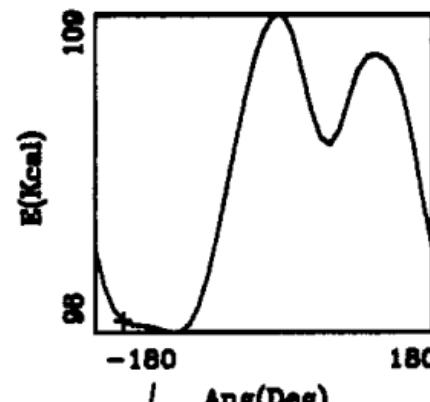


1993

## Conformationally Restricted Phe-Leu Dipeptide Mimetic



X            Y  
-150        99

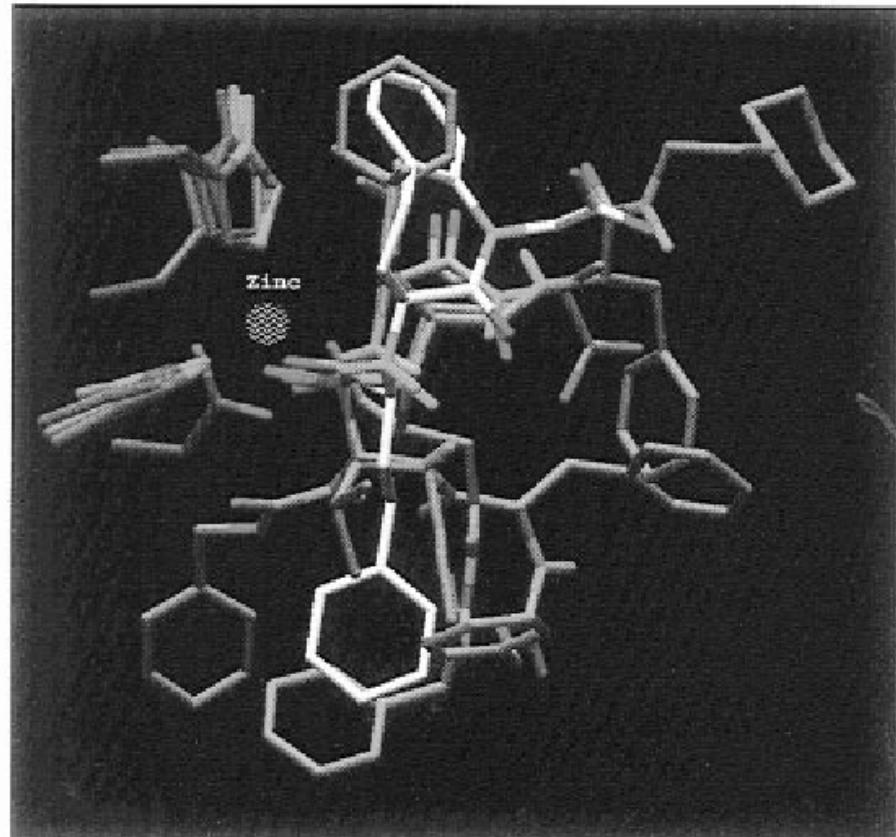
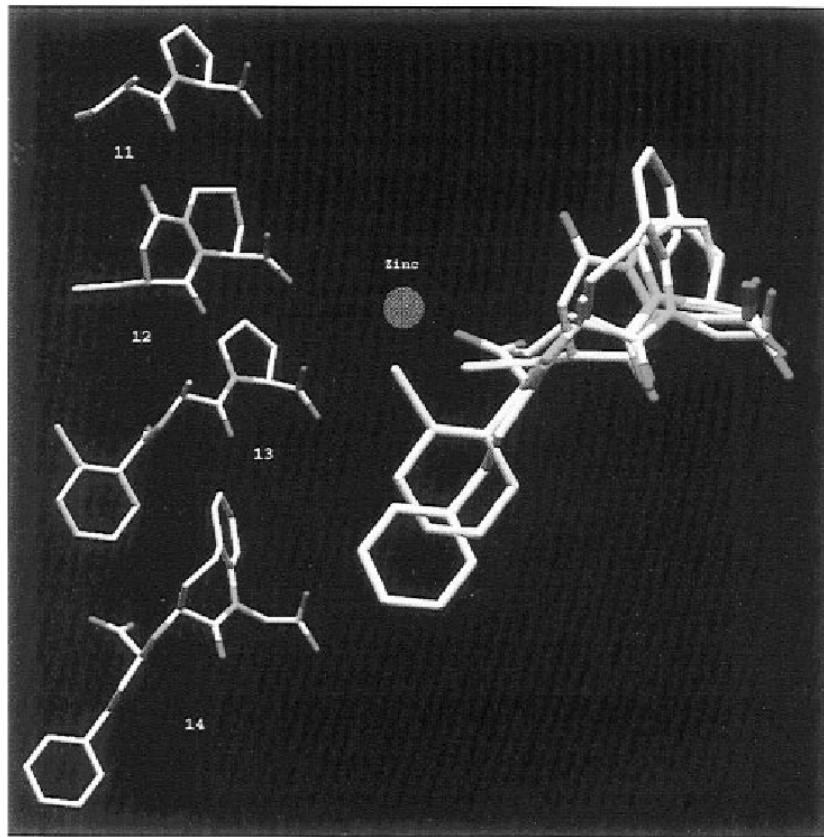


J. Med. Chem. 1993, 36(16), 2420



1996

## Dual NEP/ACE Inhibitors

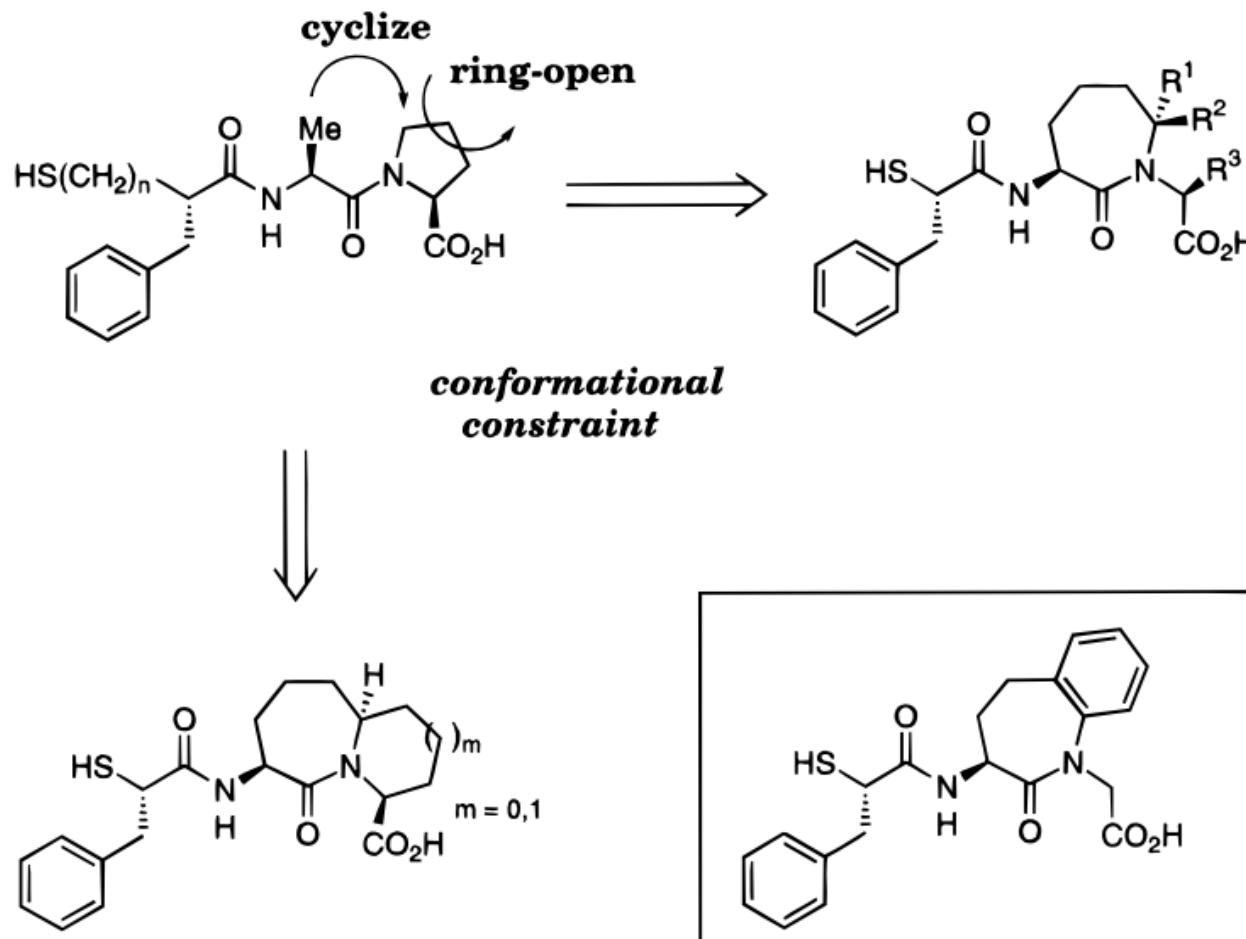


J. Am. Chem. Soc. 1996, 118(35), 8237



1999

## Cyclic Analogues

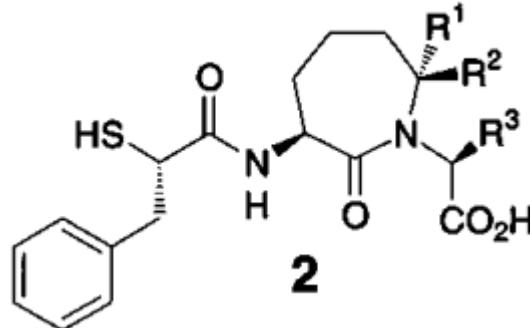


J. Med. Chem. 1996, 39, 494-502



1999

## Cyclic Analogues – a classical “med-chem” approach



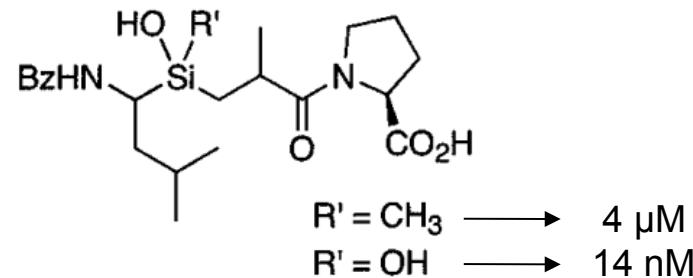
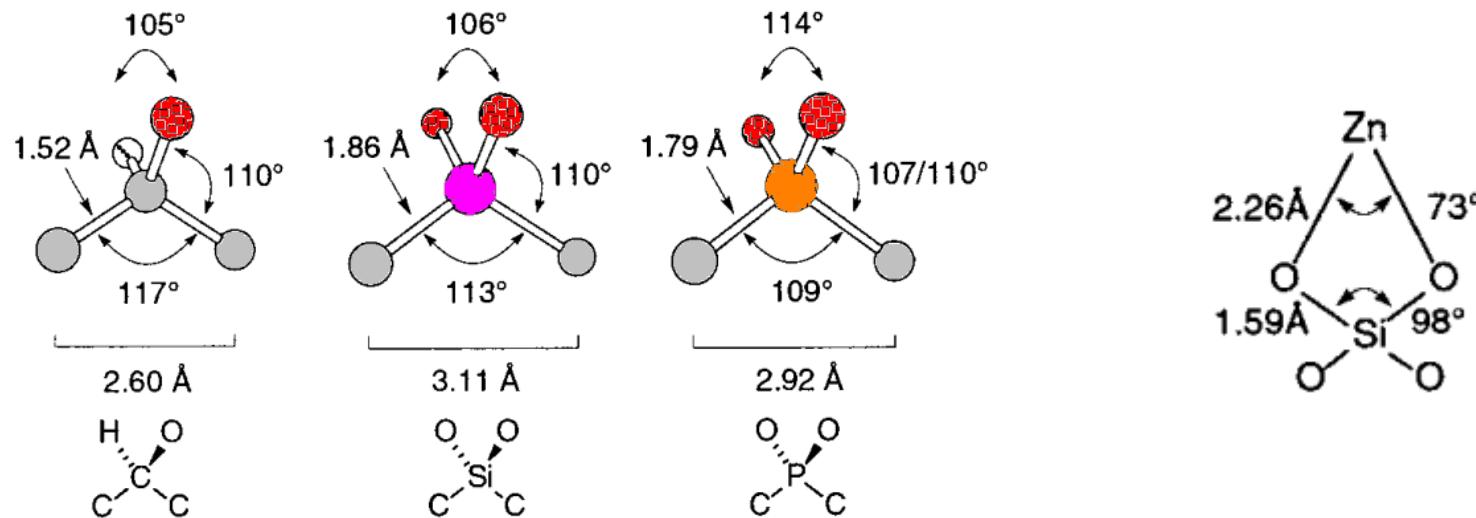
R <sup>1</sup>	R <sup>2</sup>	R <sup>3</sup>	(nM) / ACE <sup>c</sup>
H	H	H	22
H	H	methyl	26
H	H	benzyl	479
H	H	isopropyl	907
methyl	H	H	8
H	methyl	H	16
propyl	H	H	11
H	propyl	H	14
allyl	H	H	7
hydroxyethyl	H	H	25
methylcyclopropyl	H	H	23
isobutyl	H	H	10
cyclopentyl	H	H	17
propyl	H	methyl	5
propyl	H	ethyl	25

J. Med. Chem. 1996, 39, 494-502



2002

## Mimicking transition state → silicon-based ACE inhibitors



J. Am. Chem. Soc. 2002, 124, 7363



## Conclusion

- Peptide scan followed by pharmacophore determination
- Large number of compounds synthesized
- Gradually improving and extending the pharmacophore helped in increasing the affinity of the lead compound
- Various additional techniques were employed
- Drug (candidates) with excellent affinity and properties could be designed