

**D3R GC4:
On-the-fly sampling of macrocycle conformations
during docking to BACE-1**

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@ForliLab

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Overview

Macrocycle flexibility model for docking

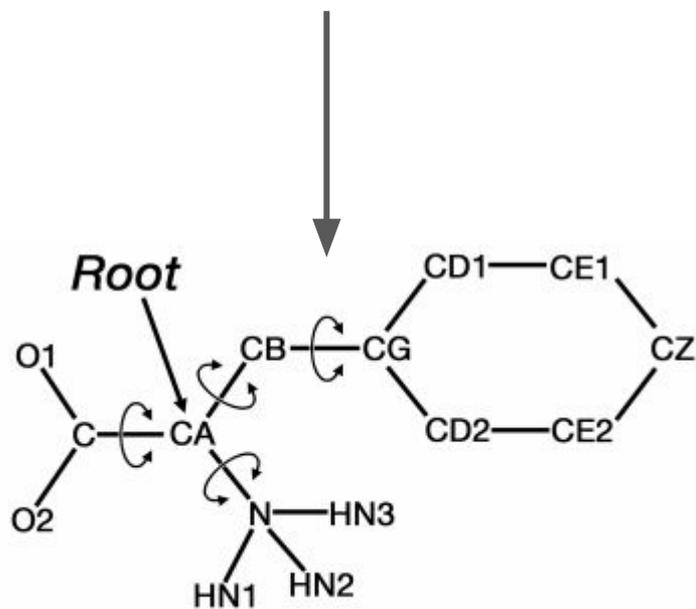
Capture binding pocket variability using multiple receptor conformations

Application of AutoDock-GPU
(OpenCL, gradient-based local search)

Limitations of the ligand flexibility representation

Rotatable bonds are independent from each other and rotate atoms downstream from the “root”

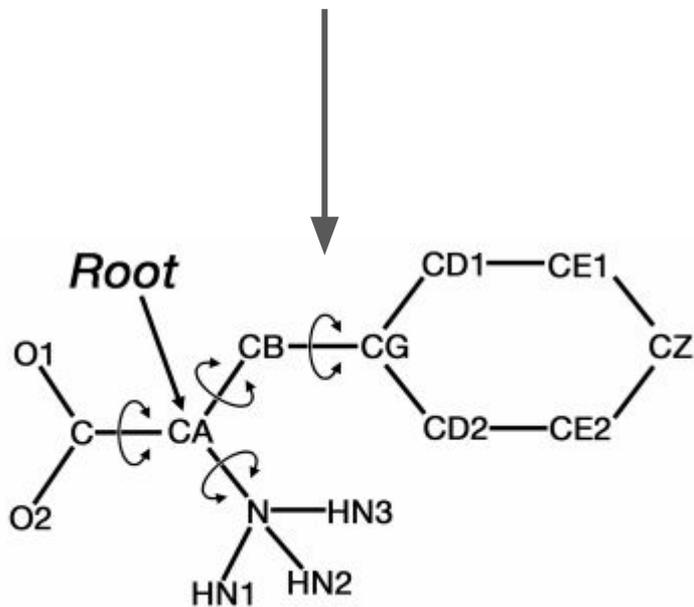
This torsion affects only the ring



Limitations of the ligand flexibility representation

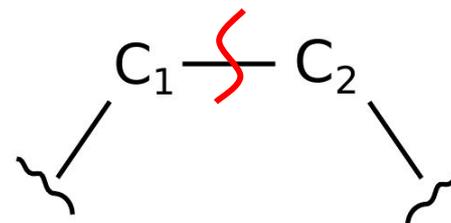
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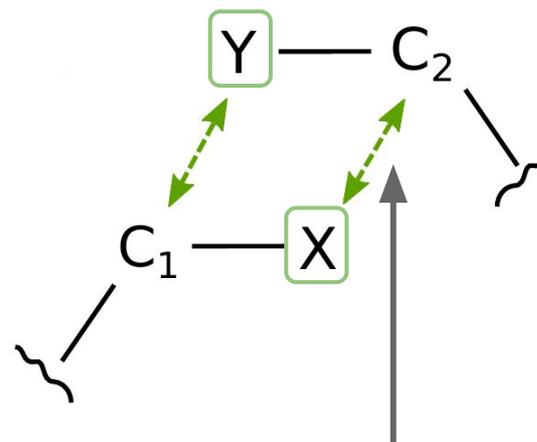
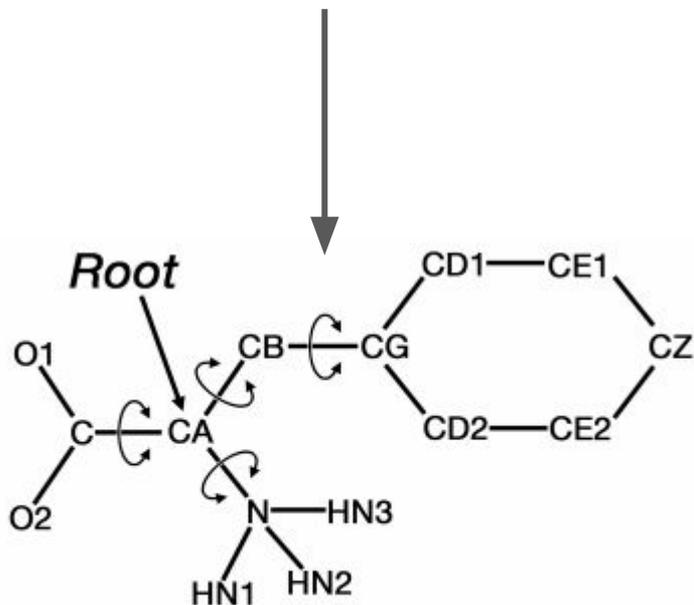


For macrocycles, rotatable bonds must be perturbed in a concerted way

Macrocycles are modeled in an open state and closed during docking



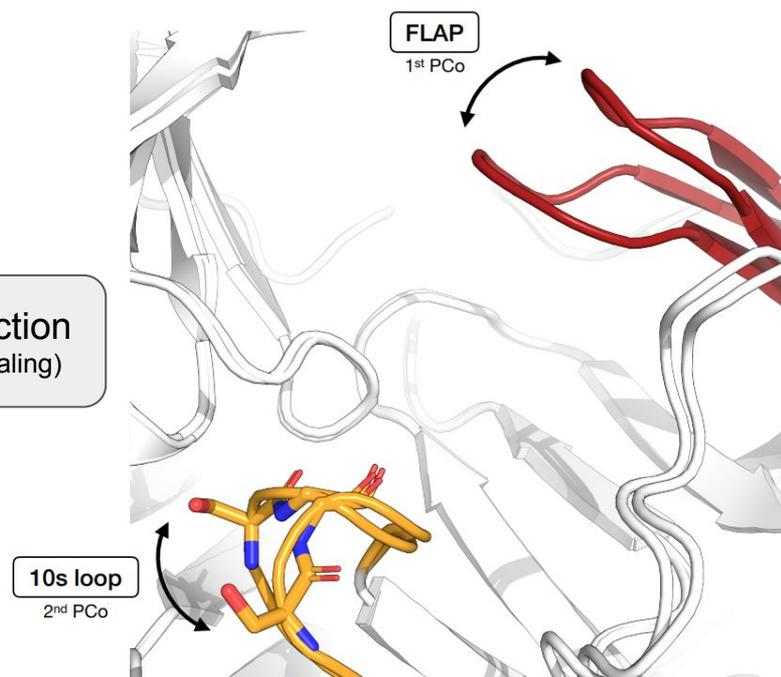
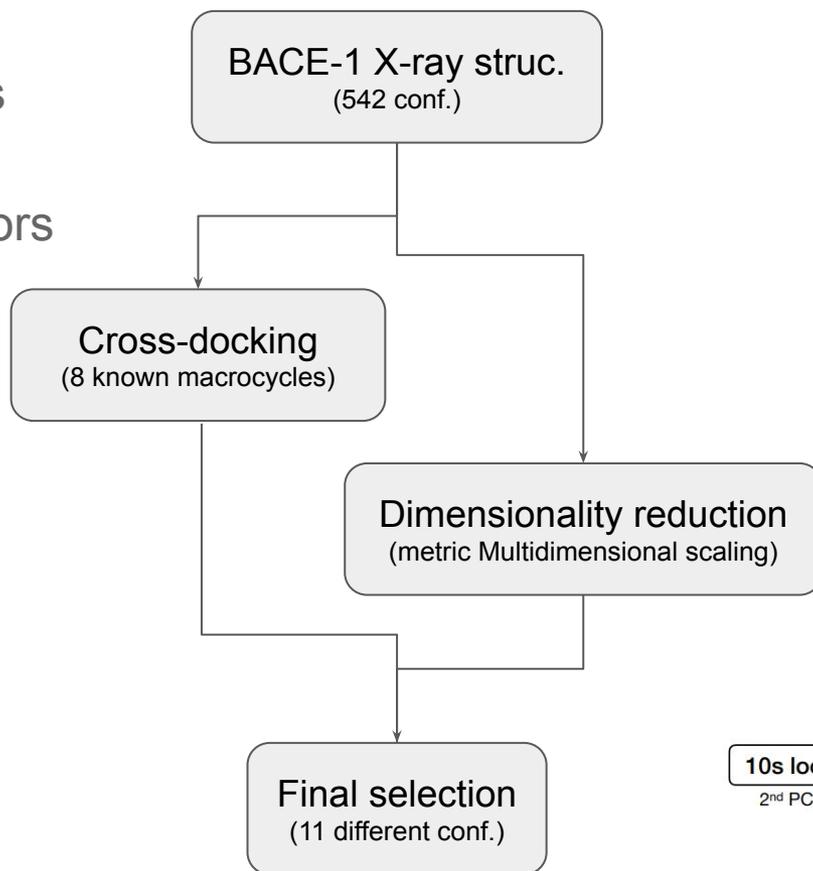
This torsion affects only the ring



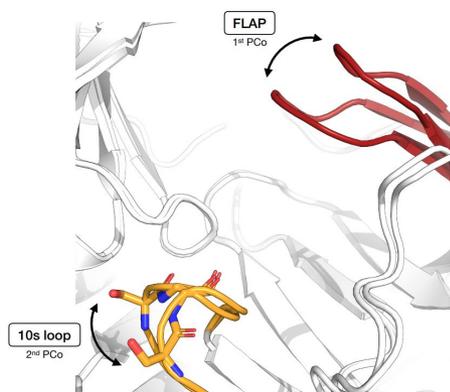
Linear attractive potentials
(50 kcal / mol / Å)

Selection of representative protein conformations

similar ligands
should bind to
similar receptors



Top poses docked in similar receptor conformations

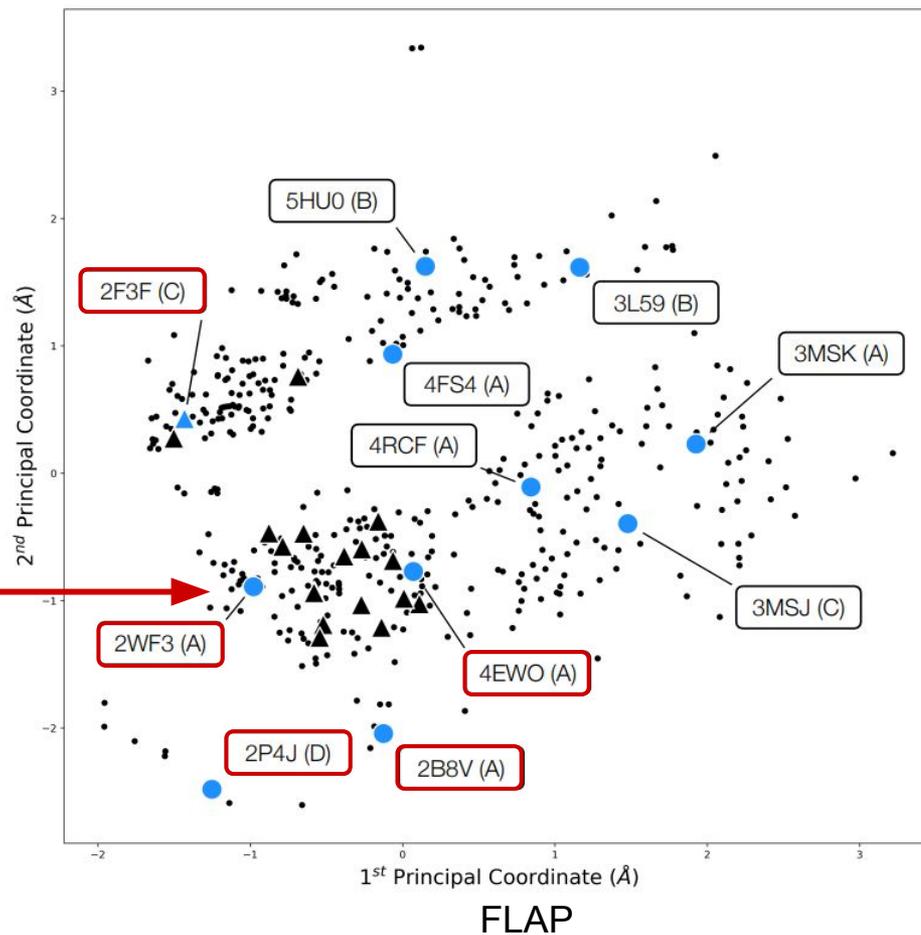


10s loop

11 out of 20 ligands docked to **2wf3** (does not contain macrocycle)

The rest in **2f3f**, **2p4j**, **2b8v** and **4ewo**

Metric Multidimensional Scaling using RMSD of 10s and flap loops



Accelerating AutoDock4 on GPU

<https://github.com/ccsb-scripps/AutoDock-GPU>

Scoring function evaluation steps:

50x - 200x faster (Solis-Wets)

10x - 50x faster (ADADELTA gradient-based)
(...but less evals required -> more accurate)

search	mean RMSD (Å)	N < 2 Å
SW	8.49	1 / 20
ADA	1.52	18 / 20

Overall performance comparable to Vina on 8 cores.
(Vina has a simpler scoring function)

In collaboration with
Leonardo Solis-Vasquez and Andreas Koch
from TU Darmstadt, Germany

Each submission focused on a different aspect of docking

Standard dockings

- scoring function only
- post-processing filter & visual inspection
(based on known ligands)

Modified dockings

- biased docking potential (known interactions)
- hydrated docking

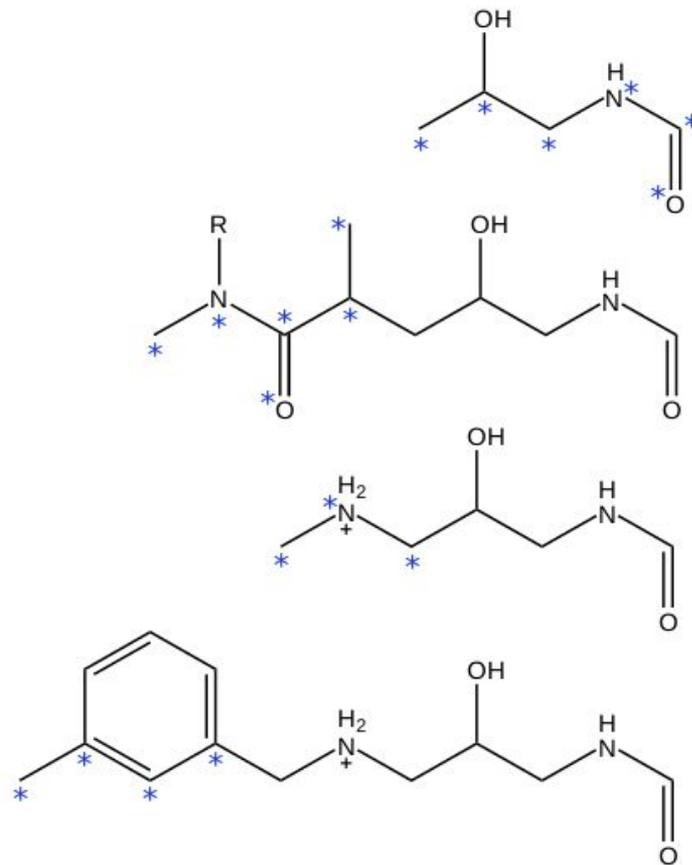
Using existing ligands as templates to filter poses

Dry receptor (Stage 1a)

filters	mean RMSD (Å)	N < 2 Å
No	2.35	12 / 20
Auto	1.56	18 / 20
Visual	1.29	20 / 20

With X-ray water (Stage 1b)

filters	mean RMSD (Å)	N < 2 Å
No	1.52	18 / 20
Auto	1.12	19 / 20



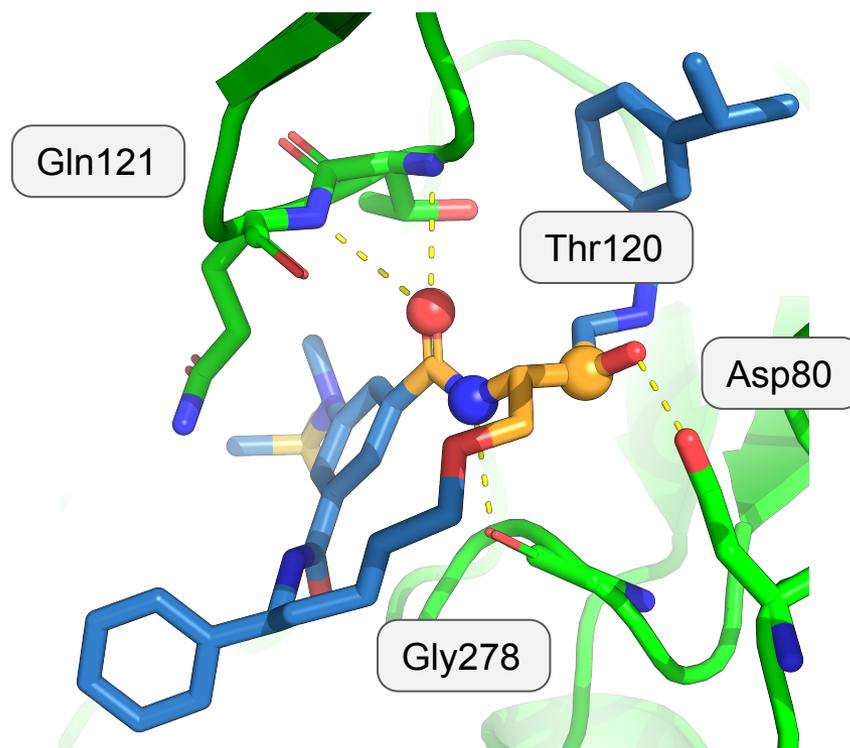
Docked poses that do not overlap with known binding modes are excluded

Using known binding modes to steer ligands to correct position

Distance-dependent penalty:

$$P = \begin{cases} 0, & \text{if } r \leq 1.2 \text{ \AA} \\ 10^5 \times r, & \text{otherwise} \end{cases}$$

bias	mean RMSD (Å)	N < 2 Å
No	1.36	19
Yes	1.13	20



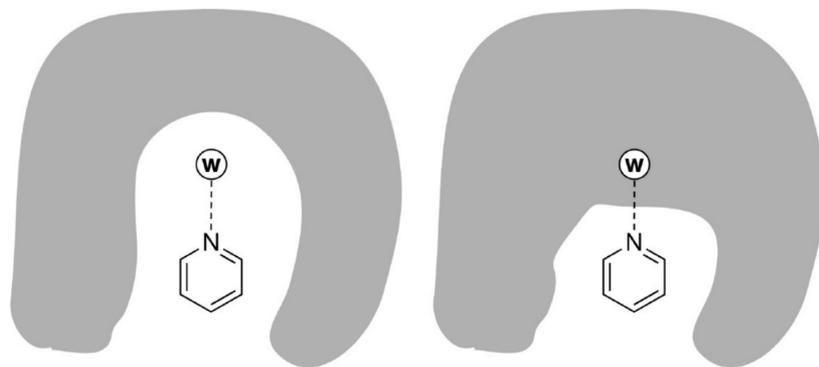
BACE-1 in complex with a macrocycle inhibitor
(PDB ID: 4dpf)

X-ray waters were crucial for pose prediction

Ligand hydration

("hydrated docking", predicted on the fly)

Forli *et al.* J. Med. Chem. 2012

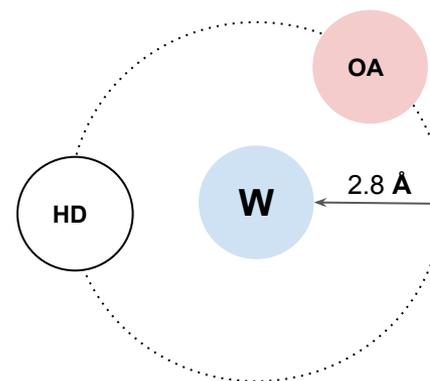


water conserved

water displaced

Receptor hydration

(x-ray waters)



spherical HB don/acc water model

X-Ray water	hydrated lig.	mean RMSD (Å)	N < 2 Å
No	No	2.96	8
No	Yes	2.83	7
Yes	No	1.36 (1.52)	19 (18)
Yes	Yes	1.31	19

Ranking 154 ligands by affinity

MM/GBSA performed comparably to docking scores (Kendall Tau ~ 0.2)

In collaboration with:

Sukanya Sasmal, Léa El Khoury, David Mobley

UC Irvine

There will be a poster by Sukanya

Conclusions

Gradient based local search: much better search performance

X-ray waters: very important (...but hard to model)

Receptor conformation: important but not critical (at least for these ligands)

Pose filters and bias: beneficial in Stage 1a (without waters)

Pose ranking: very hard (with both scoring function and MM/GBSA)

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Ranking in Stage 1a

Exclusion of poses that do **not** match the native pose of known ligands

