

# Converging a knowledge-based scoring function: DrugScore<sup>2017</sup>

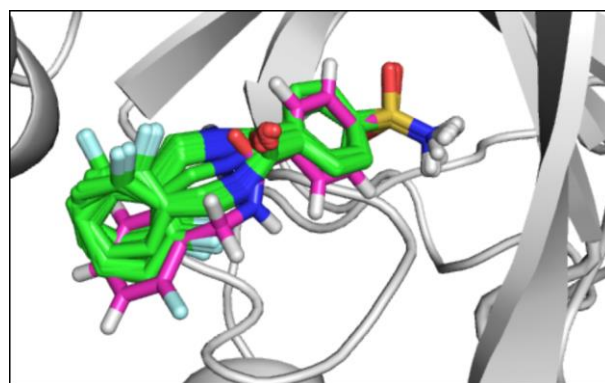
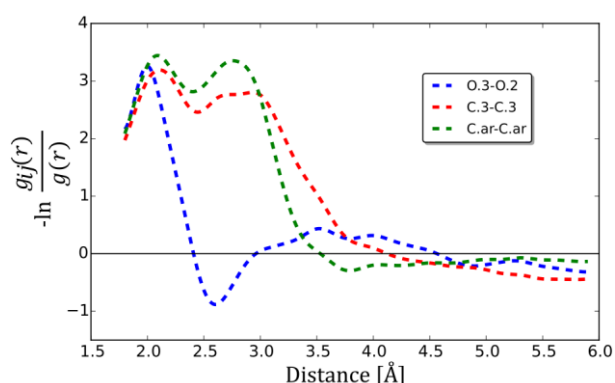
Jonas Dittrich<sup>1</sup>, Denis Schmidt<sup>1</sup>, Christopher Pflieger<sup>1</sup>, Holger Gohlke<sup>1</sup>

<sup>1</sup>Heinrich Heine University Düsseldorf, Universitätsstr. 1, 40225 Düsseldorf, Germany

Scoring functions play a vital role in molecular modeling. They are used in docking, virtual screening, *de novo* design, lead optimization, and other applications to evaluate protein-ligand interactions.

In 2000, DrugScore, a knowledge-based scoring function for protein-ligand complexes, was presented by Gohlke *et al.* [1]. DrugScore was successfully applied to score protein-ligand interactions [2] and as an objective function for docking [3]. At that time, about 1300 protein-ligand complexes from the PDB were used to derive distance-dependent pair-preferences for 18 atom types. Since then, structural information in the PDB increased by a factor of 10. This fact provided the incentive for us to re-derive the distance-dependent pair-preferences asking how much structural information it takes to reach a converged knowledge-based scoring function and whether the additional information further improves the predictive power of DrugScore.

DrugScore<sup>2017</sup> was derived from about 40,000 complexes following the protocol from the previous work [1]. The newly derived pair-preferences cover a broader range of atom types and now include also less common interactions, e.g., involving halogens or metals. For evaluating the predictive performance, we chose two data sets: the CASF-2013 test set [3], providing complexes and associated affinities and the PDBbind “Refined set” [4], comprising more than 4000 crystal structures.



DrugScore<sup>2017</sup> shows a substantial and significant increase in scoring, ranking, and docking power compared to DrugScore. I) In re-docking experiments, ~ 80 % of the generated poses showed RMSD < 2 Å compared to the crystal structure. II) The Pearson correlation of predicted and experimentally determined binding energies is 0.601 ( $p < 0.001$ ) on the CASF test set and 0.526 ( $p < 0.001$ ) on the PDBbind “Refined set”, without any further modifications or training. This makes DrugScore<sup>2017</sup> the best non-trained scoring function tested on the CASF set.

Finally, re-deriving DrugScore<sup>2017</sup> on several bootstrapped subsets of the currently available data yielded pair-preferences that were indistinguishable from those derived on the full complex dataset, suggesting that the available amount of data may be sufficient to obtain converged pair-preferences.

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