## DE NOVO DRUG DESIGN WITH MACHINE INTELLIGENCE Gisbert Schneider

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Drug design may be regarded as a pattern recognition process. Medicinal chemists are skilled in visual chemical structure recognition and their association with (retro)synthesis routes and pharmacological properties. In this context, various "artificial intelligence" (AI) methods have emerged as potentially enabling technology for drug discovery and automation, because these systems aim to mimic the chemist's pattern recognition process and take it to the next level by considering the available domain–specific data and associations during model development. Part of the appeal of applying AI methods in drug design lies in the potential to develop data-driven, implicit model building processes to navigate vast datasets and to prioritize alternatives. This represents at least a partial transfer of decision power to a machine intelligence, and could be viewed as synergistic with human intelligence; that is, a domain-specific implicit AI that would augment the capabilities of medicinal chemists in drug design and selection. More ambitiously, the ultimate challenge for drug design with AI is to autonomously generate new chemical entities with the desired properties from scratch (*de novo*), without the need for the often prohibitively costly experimental compound screening.

We will review the principles of AI methods for *de novo* drug design, emphasizing ligandbased approaches that have proven useful and reliable in "little-data" scenarios. Selected prospective case studies will be presented, ranging from targeted molecular design to fully automated design-make-test-analyse cycles. We provide a critical assessment of the possibilities and limitations of the individual approaches and dare forecasting the future of drug design with machine intelligence.

## References:

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