

Leveraging Evotec AI/ML-DMTA engine for project acceleration

Evotec Drug Discovery Chemistry



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Drug Discovery Chemistry community

Rich pool of talent at all levels

Drug Discovery Chemistry Leadership Team

- Wealth of drug discovery experience and insight applied to all projects and collaborations

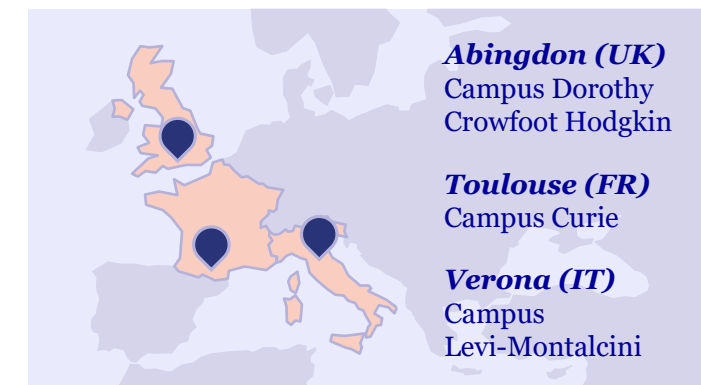
Project Leaders

- Experienced cohort of project leaders (typically 10-15 years' experience)
- Single point of contact with client
- Talented scientists with a proven track record of delivery (quality chemical assets, publications, patents, keynote presentations etc.)

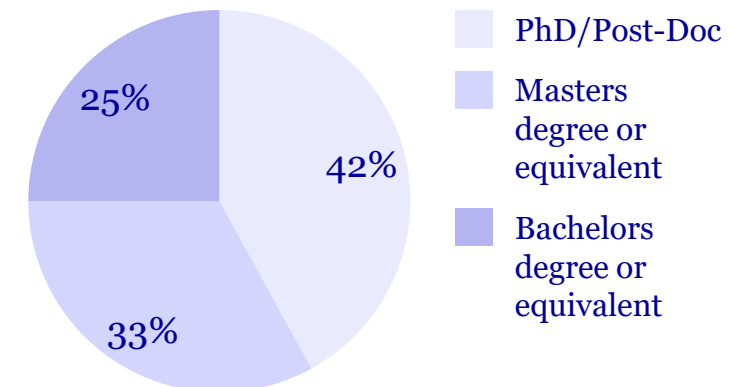
Chemistry Resource

- Global capacity of 500 chemists encompassing medicinal, analytical and computational chemistry
- High quality design and synthetic capabilities (~350 lab chemists; 40% female: 60% male)
- High proportion (>42% lab-based and ~50% overall) of PhDs
- Knowledge and experience in AI/ML generative and computational design and cheminformatics

Integrated Drug Discovery sites



Diploma level of lab chemists





Drug Discovery Chemistry at Evotec: the right organizational synergies

Our key ingredients for a successful Drug Discovery Chemistry collaboration

Technology differentiators

Industry-leading suite of AI/ML and advanced computational tools

- Development of cutting-edge in silico predictive, generative and analytical tools
- Multi objective AI/ML-based design workflow
- Emphasis on design precision and smooth integration with lab expertise
- Predictive safety (Transcriptomics, Cell Painting, ...)



Our seasoned drug hunters “The human catalyst”

Our people – passion, expertise, problem solving

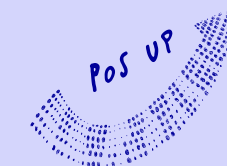
- Strong disease understanding and target family expertise
- Rapid response time & decision-making
- MedChem extensive experience with strong track record in CD nominations and inventorship contribution



Process fundamentals

Flexibly accessible chemistry platform

- Rapid cycle times, e.g., DMTA
- High quality delivery
- Multiple modality, efficient synthetic execution platforms

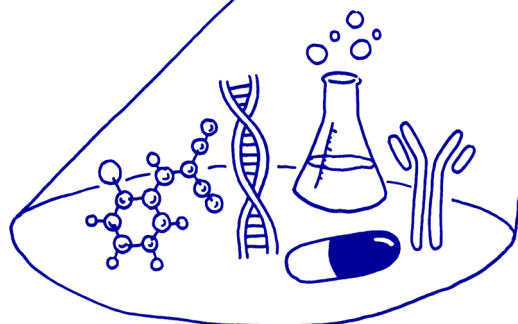




A track record of success: selected Discovery & Development KPIs

“Evotec Inside” our partners’ pipeline contributions

TOGETHER
FOR MEDICINES
THAT MATTER



>16

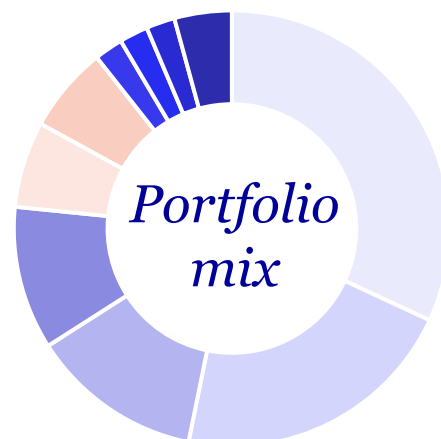
*PDCs nominated
since 2020*

28

*IND packages supported
since 2020*

>5

*Manufactured clinical agents
and commercial APIs since
2020*



■ Oncology
■ Infectious Disease
■ Dermatology
■ Respiratory
■ Rare Diseases

■ CNS
■ Metabolic Disease
■ Inflammation & Immunology
■ Gastroenterology
■ Other

>100

*Patents with Evotec
inventors published since
2020*

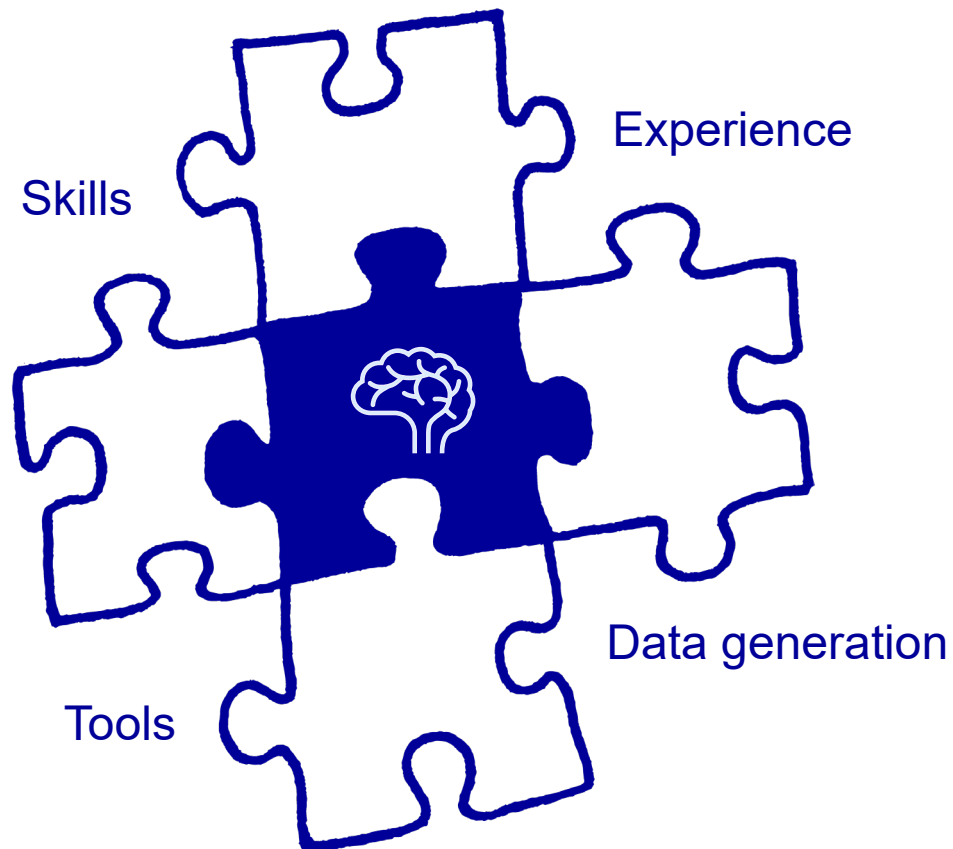
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*Research articles
published since 2020*



The secret sauce for Excellence in Molecular Design at Evotec

Combining skills, tools, experience, experimental data and integration/communication



Molecular Architects

CompChem & MedChem

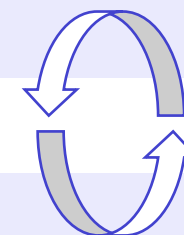
CompChem expertise and access to state-of-the-art in silico tools as well as highly sophisticated AI/ML tools developed by in silico R&D

MedChem extensive experience and expertise with strong track record of CD identification

In silico R&D

CompChem & Software Development

Develop cutting-edge tools and methods



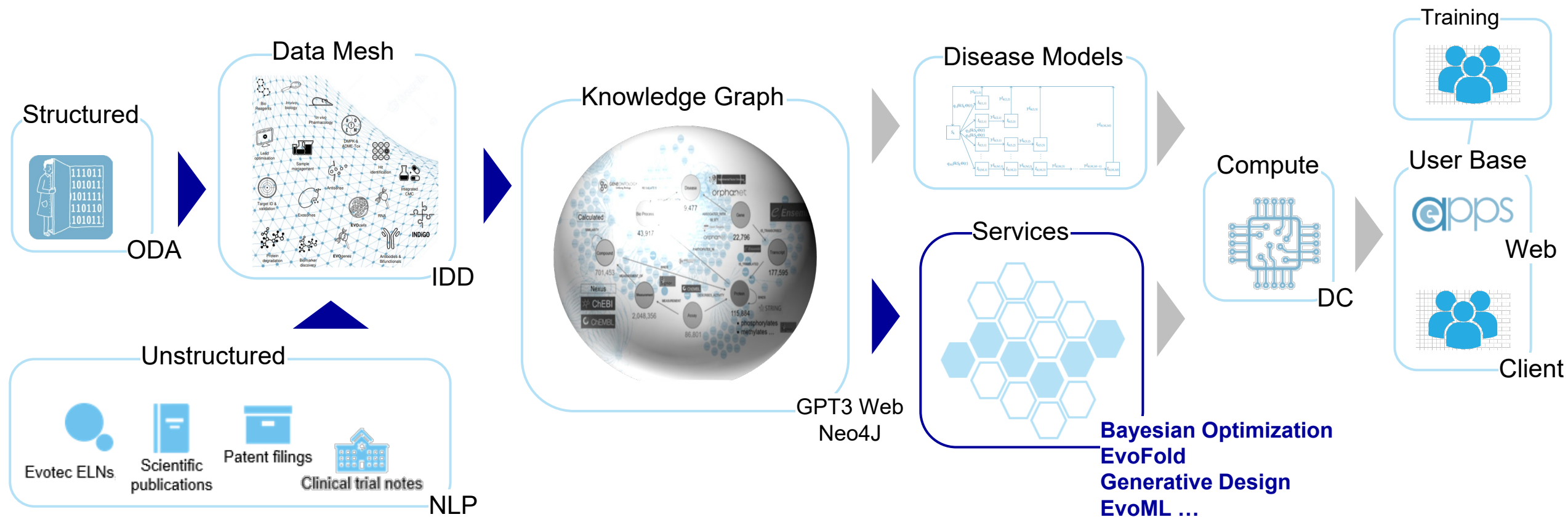
Laboratory data generation

An “all-under-one-roof” molecular design solution to accelerate the path to CDs



isR&D in a Nutshell

Integrating data science & AI



Data

Information

Knowledge

Impact



Evotec's "Design EVolution" philosophy

Our core design and make principles to enable access to tomorrow's medicines

Gap Analysis

How do compound properties differ from the target profile? How can this be improved?

Define the Pharmacophore

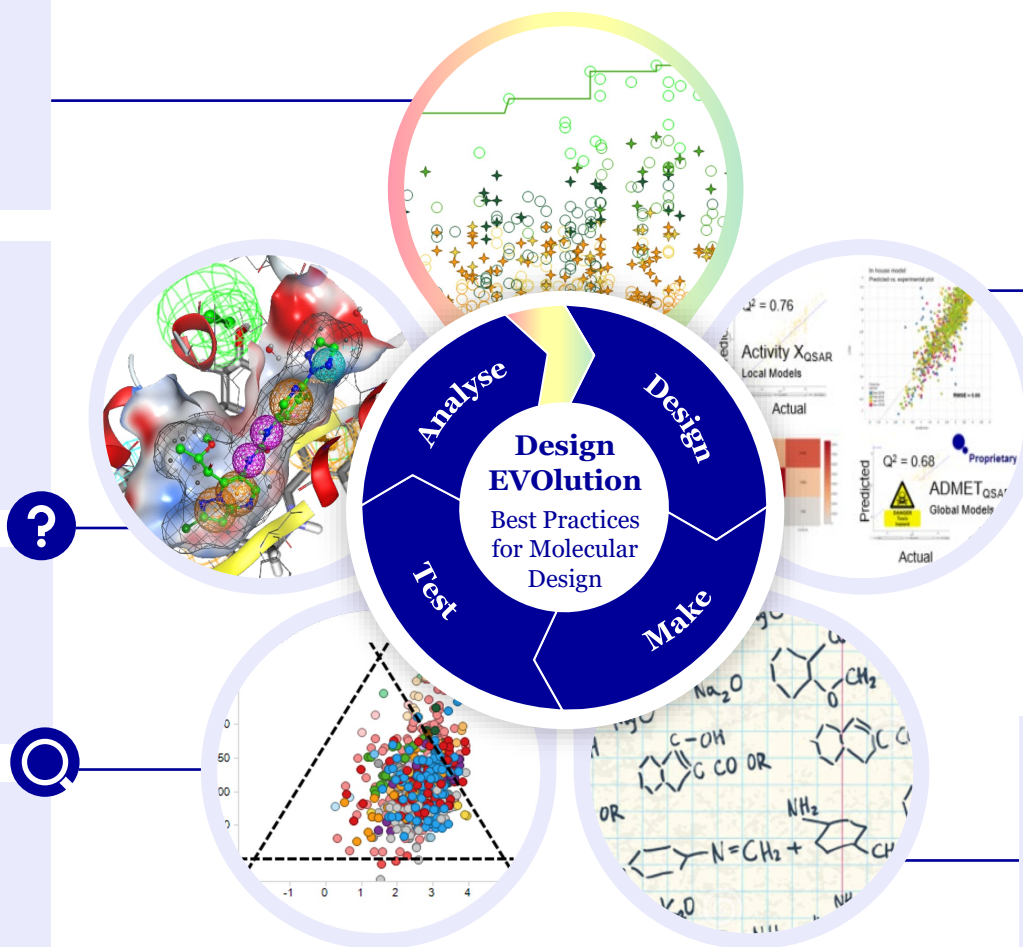
Which molecular features are driving compound potency?

Molecular conformation

Understand impact on biological & property profile

Focus on properties

Align with desirable property space.
Make the right compounds first time.



Design Efficiency

Rapid iterative design. Matched pairs.
Maximum information from fewest compounds.



In Silico Methods

DMPK models. Local ML models.
Prediction-driven, generative design
and active learning (AI/ML/DL).



Make-Synthesis

Right first time. Good chemical route
planning & execution. Minimize needs
for re-synthesis. Apply best technologies.



Industry-leading suite of AI/ML and advanced computational tools

Experts in application of E.INVENT-AI design toolkit and Design EVolution philosophy



AI Structure Generation

Molecular autoencoders, SLERP
latent space exploration



Generative Design

Reinforcement learning based
generative design



Predictive Models

Streamlined ML model training &
application – global and local models
for virtual selection



Transforms

Molecular optimization using coded
expert medchem transformations



Bayesian Optimization

Design for model construction
and optimization



3D Protein Structure prediction and exploitation

CryoEM, MD, FMO, MMGBSA, FEP
determination & exploitation of
compound-protein interactions



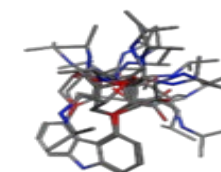
AI Assisted Design

AI-guided virtual library generation
using known reaction data



Matched Molecular Pairs

Prediction of properties
using statistical historical data



4D NMR conformation & QM conformation prediction

Exploitation of conformational
design for activity and disposition

Generative AI, evaluative prediction tools, experimental techniques and drug-hunting expertise creates current state-of-the-art design




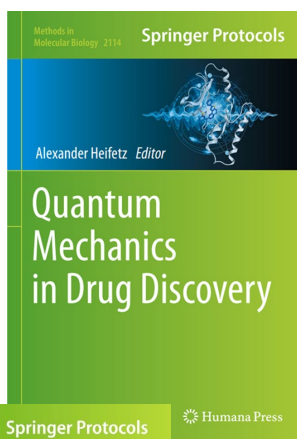
Methods in
Molecular Biology 2716

Springer Protocols

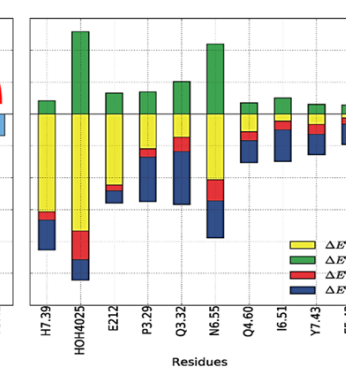
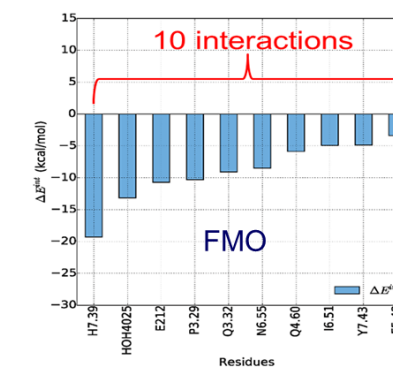
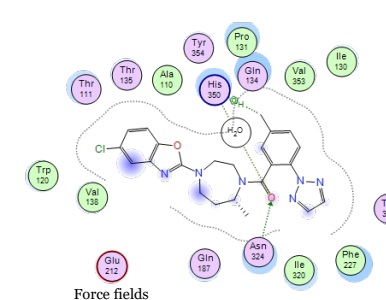
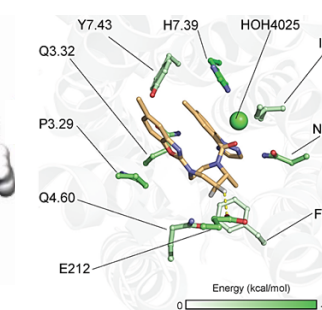

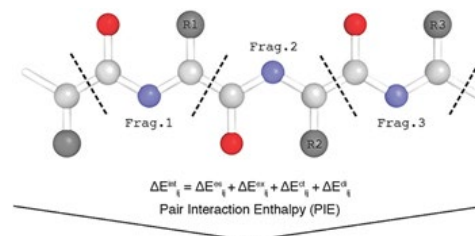
Alexander Heifetz
Editor

High Performance
Computing for
Drug Discovery
and Biomedicine

 Humana Press



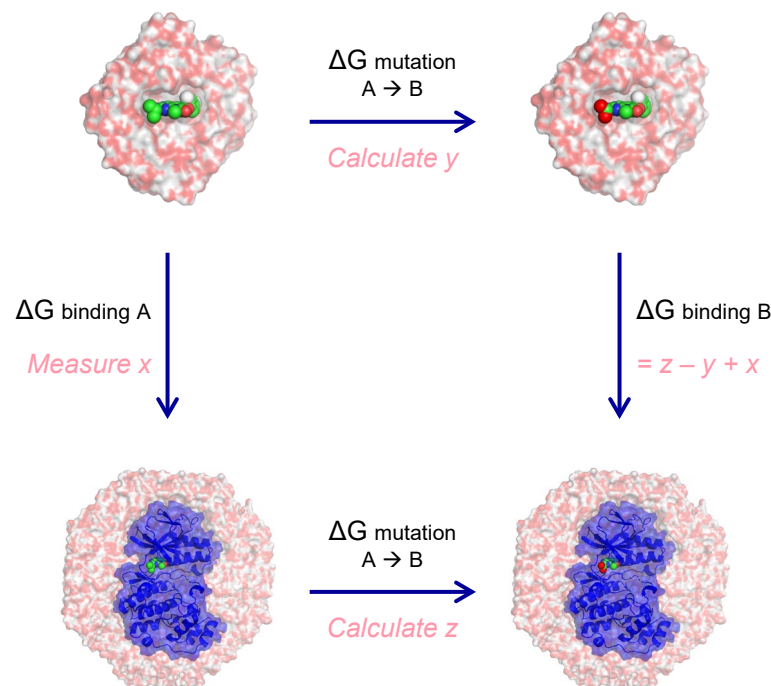
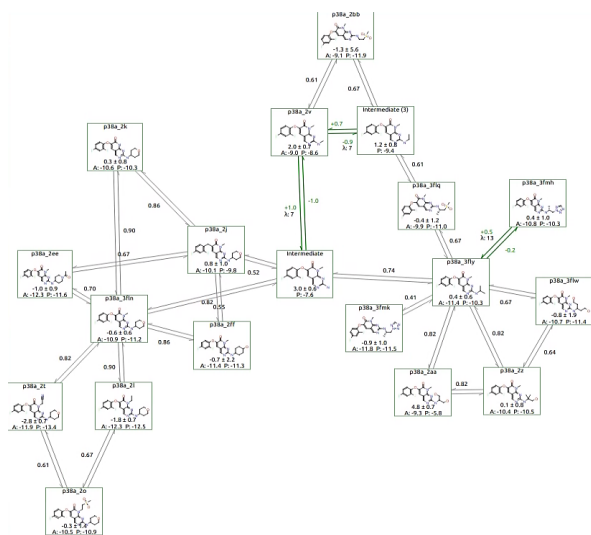
- Protein-ligand or protein- protein interactions in kcal/mol and their chemical nature (electrostatic or hydrophobic)



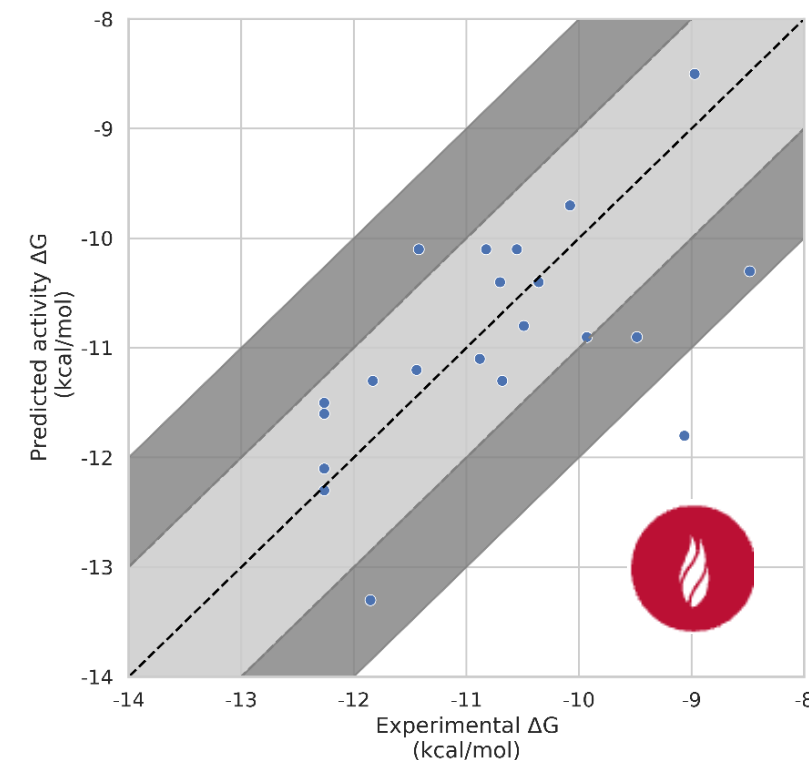


Cutting-edge technologies and High Computing Power for excellence in Molecular Design – FEP

- FEP uses molecular dynamics (MD) simulations to calculate the energy of mutating one ligand into another
- Many of these simulations are carried out at Evotec's Frankfurt Data Center to calculate the binding affinity of AI generated designs



Data generated for p38 kinase ligands using Flare (Cresset) FEP software



Accurate prediction of potency for final prioritization

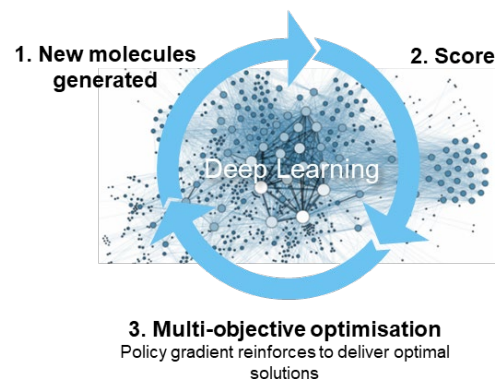


Small Molecule Generative Design using AI/ML

Examples of Deep Learning, Transformers, Reinforcement Learning, Autoencoders, Bayesian Optimization

eINVENT

Reinforcement learning of a SMILES generator



SLERP

Spherical interpolation in the Hypercube

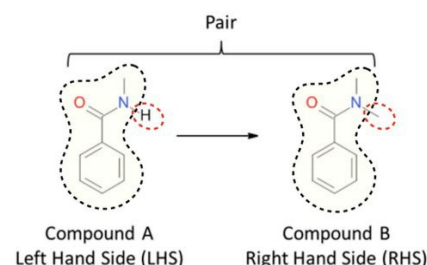


Pocket2Mol

3D exploration of pockets
Including fragment growing and linking

Asphodel

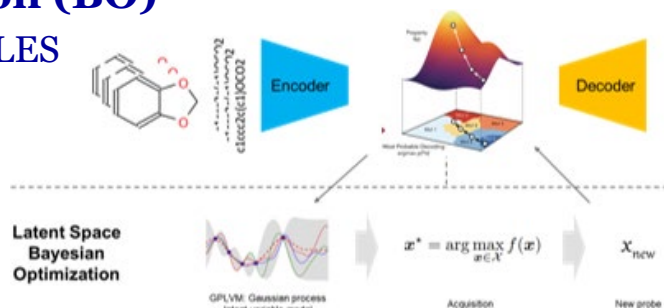
Ultra large library generator based on molecular pairs



in-house tools built on top of the mmpdb3.1 library predicting property changes and generating new molecular structures

Generative Bayesian Optimization (BO)

BO-based SMILES generation



A variety of AI/ML algorithms accessible for small molecule generative design



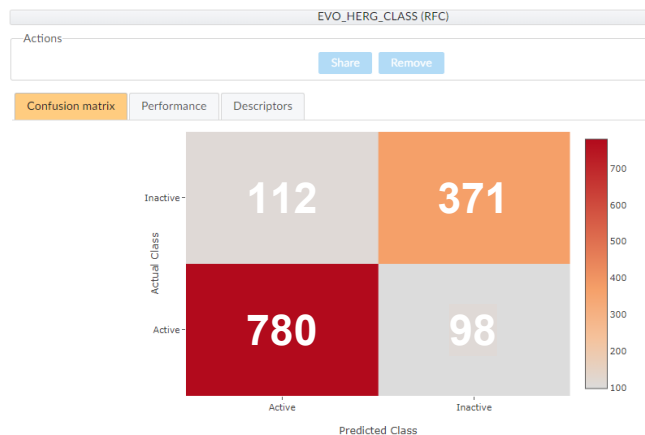
DMPK, safety & developability ML models

Mitigating compound attrition with smart prediction

Global Models

- Global Models
 - Project Models
 - ☐ EVO_PPb_HUMAN (RFR)
 - ☐ EVO_PPb_RAT (RFR)
 - ☒ EVO_LOGD (RFR)
 - ☐ EVO_MICS_HUMAN (RFC)
 - ☐ EVO_MICS_RAT (RFC)
 - ☐ EVO_MICS_MOUSE (RFC)
 - ☐ EVO_PPb_MOUSE (RFR)
 - ☐ EVO_SOLUBILITY (RFC)
 - ☐ EVO_HERG (RFR)
 - ☒ EVO_HERG_CLASS (RFC)
 - ☐ EVO_CACO2 (RFR)
 - Your Models
 - Shared Models
 - Evotec35
 - Public
 - ☐ Efflux_MDR1 (RFC)

hERG



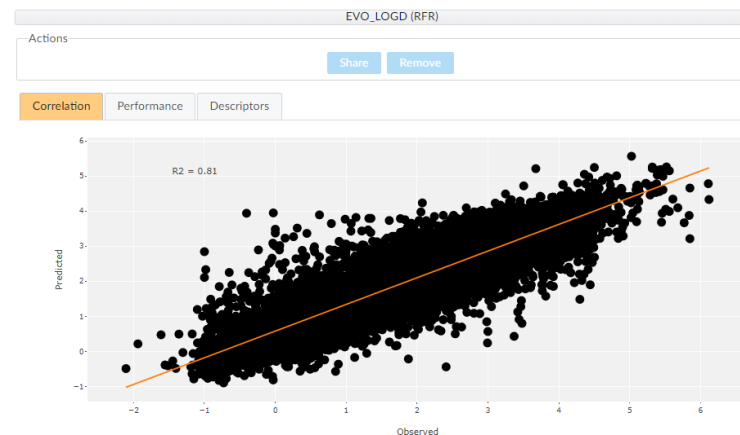
Model Performance (5-fold stratified cross validation)

Overall
Accuracy: 0.85
Cohen's kappa: 0.66

Per class

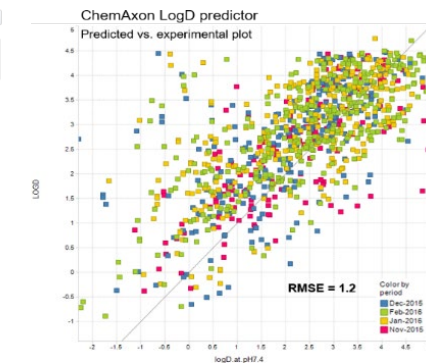
	Active	Inactive
Recall	0.89	0.77
Precision	0.87	0.79
F1 Score	0.88	0.78

LogD



Model Performance (5-fold stratified cross validation)

Overall
 Q^2 : 0.81
MAE: 0.37
RMSE: 0.26



Predictive in-silico DMPK Machine Learning models that allow projects to progress faster through more effective compound design



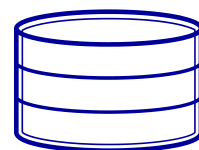
Track record of developing predictive models with demonstrated impact

Support to generative design and design selection steps

Public / Partner / Evotec data

Target	Total compounds (Annotations)	Total datapoints
Target 1	n	n
Target 2 ¹	n	n
Target 3 ¹	n	n
Target 4 ¹	n	n

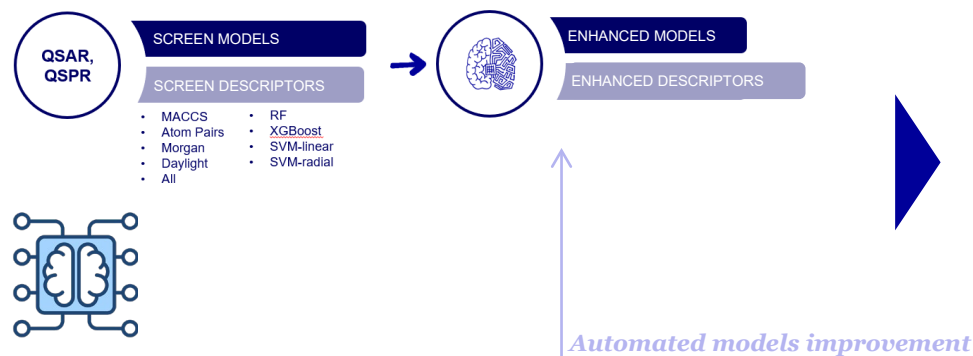
Data preparation



Project data curation & standardization
Molecules preparation

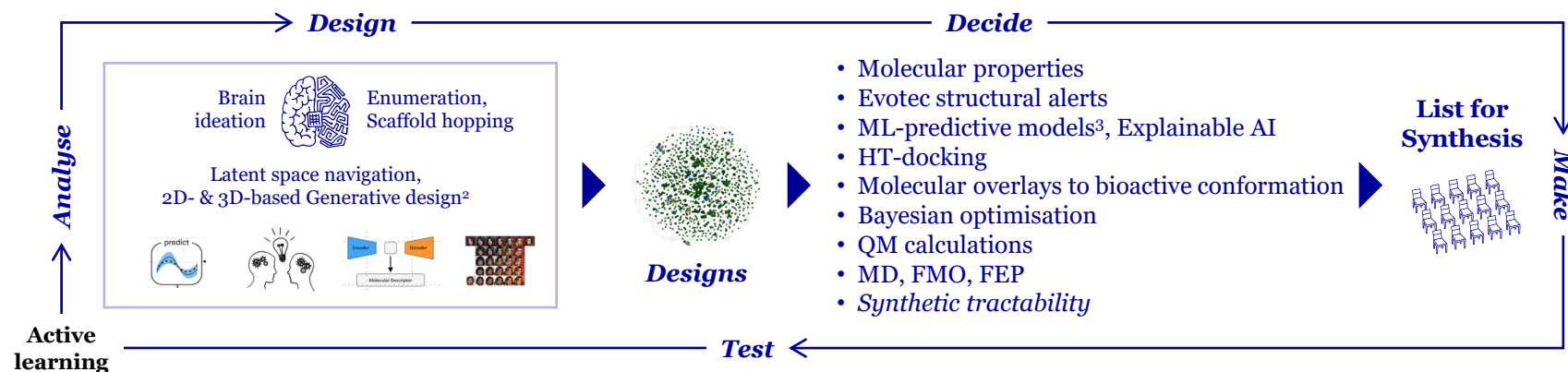
Development of predictive models

Local model development



Pipelined design (illustration)

Workflow from human/machine ideation up to compound selection for synthesis

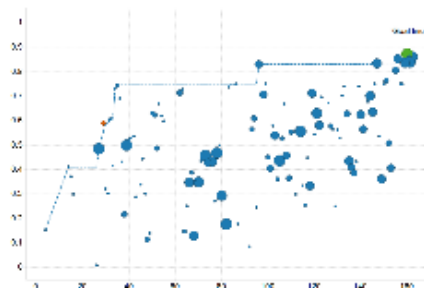




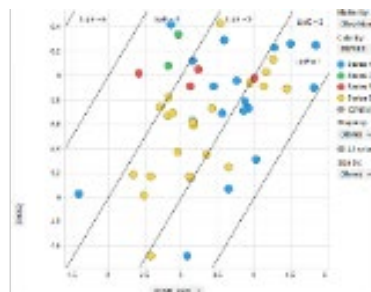
Informatics platforms to optimize DMTA speed and quality

Tools and processes for data integration and visualisation to aid design & synthesis decision making

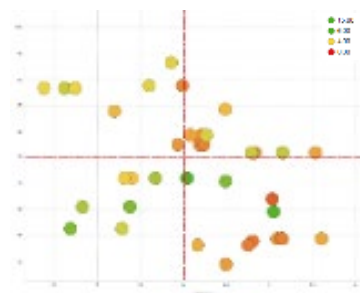
MPO¹ Telemetry



LiPE



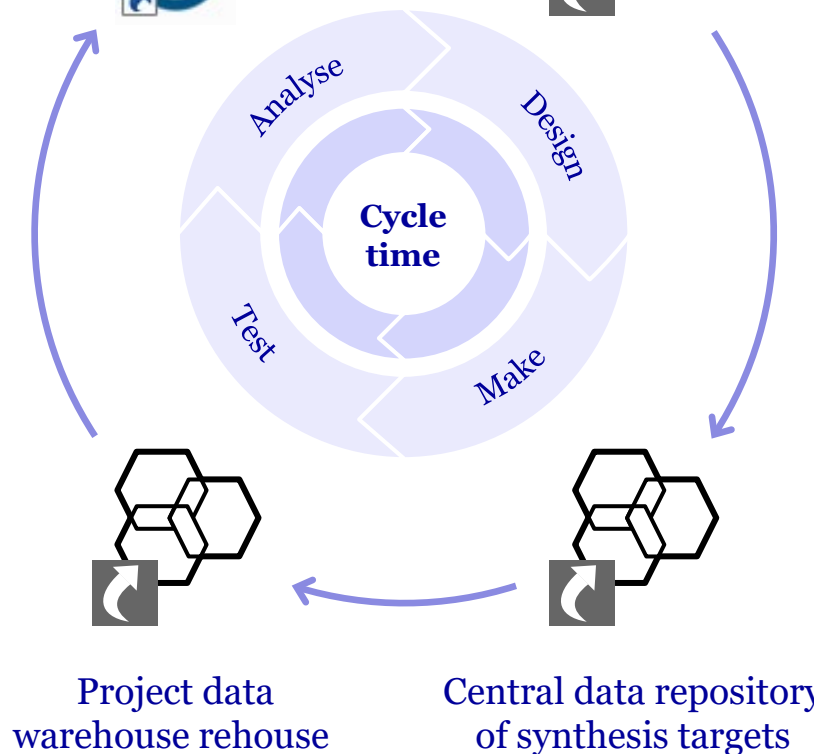
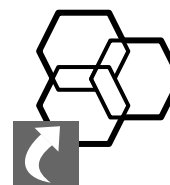
AEI²



Graphical
analysis tools



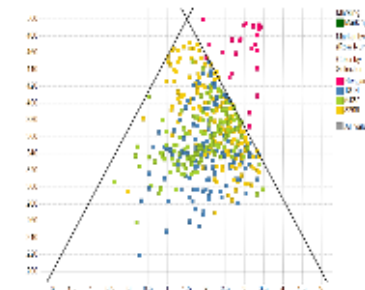
Central data repository
of target ideas



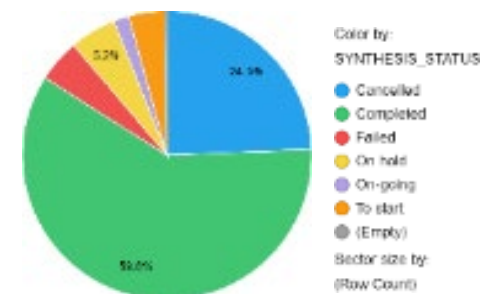
Project data
warehouse rehouse

Central data repository
of synthesis targets

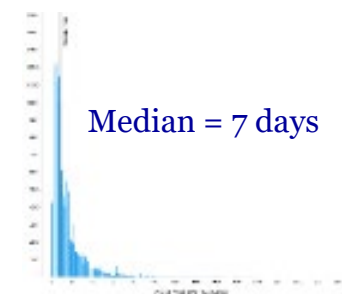
Golden Triangle Plot



Synthesis Outcome



Synthesis Cycle time





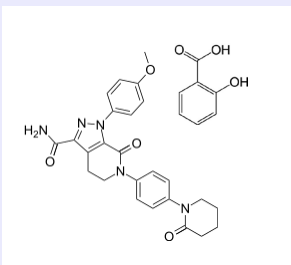
We solve complex problems in small molecule discovery

Multi-modalities and synthesis efficiency

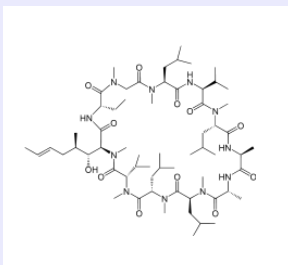
Synthetic chemistry must not be the limiting step for the preparation of therapeutically relevant molecules

Strong and Diverse Expertise

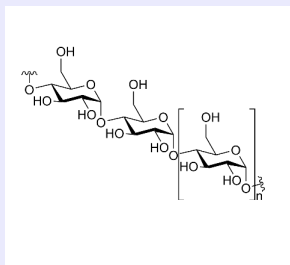
Small molecules / NP



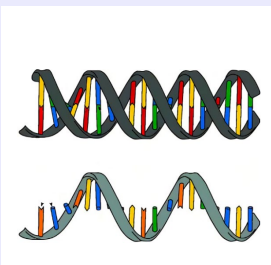
Peptides



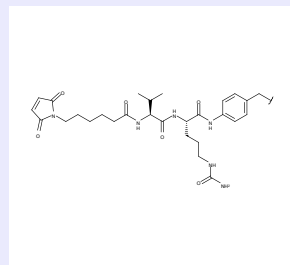
Carbohydrates



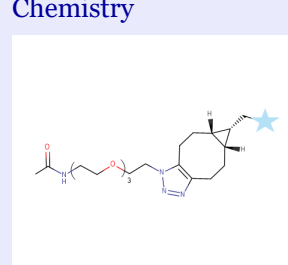
Oligonucleotides



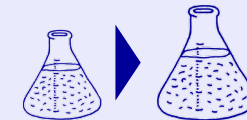
Linker Chemistry



Bio-orthogonal Chemistry



Scale-Up is ... something more than just increase the reaction size

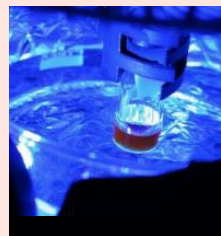


State of the art Technologies/ Strategies

Peptide Synthesis



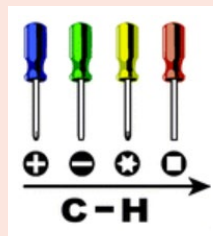
Photo-chemistry



Flow Chemistry



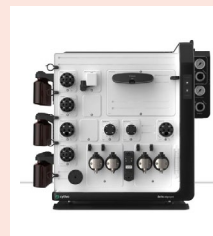
Late stage Functionalization



Parallel Synthesis



Oligonucleotides Synthesis



Electro-chemistry



Enzymatic catalysis



Capsules strategy



In addition: Green chemistry, special Gas handling (H_2 , CO, HCl, NH_3 , etc.) capabilities, Scavengers & Resins, Mechano-chemistry, Glovebox facilities OEB5 and more ...

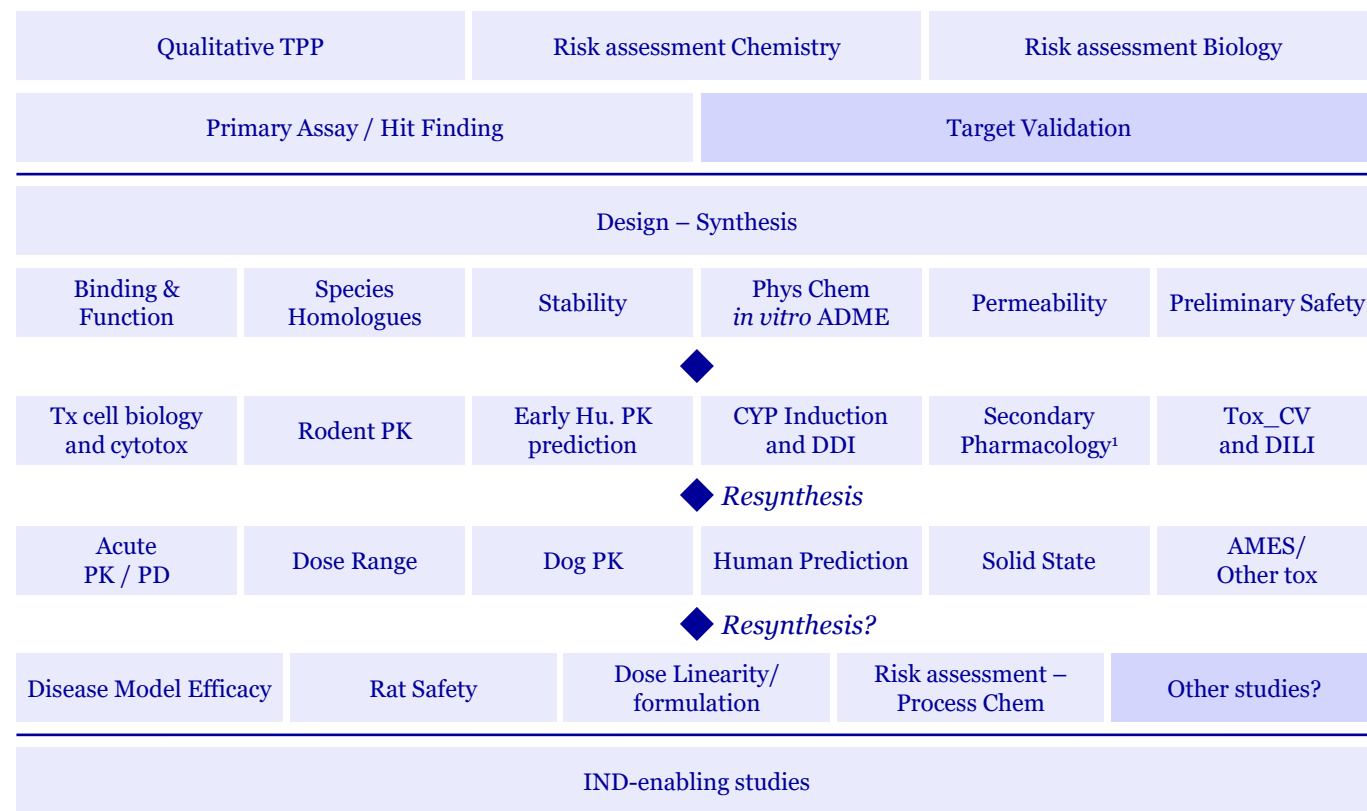


Evotec's "every compound is a CanDitate" testing paradigm

Focus on parallel approach to de-risking and control of cycle times

Evotec's parallel de-risking approach converts uncertainty-to-knowledge to aid direct navigation to high-value outcomes: e.g., delivery of a pre-clinical development candidate (CD) suitable for IND-enabling studies

Critical path activities



◆ Active decision ■ Project dependent

Cycle Times

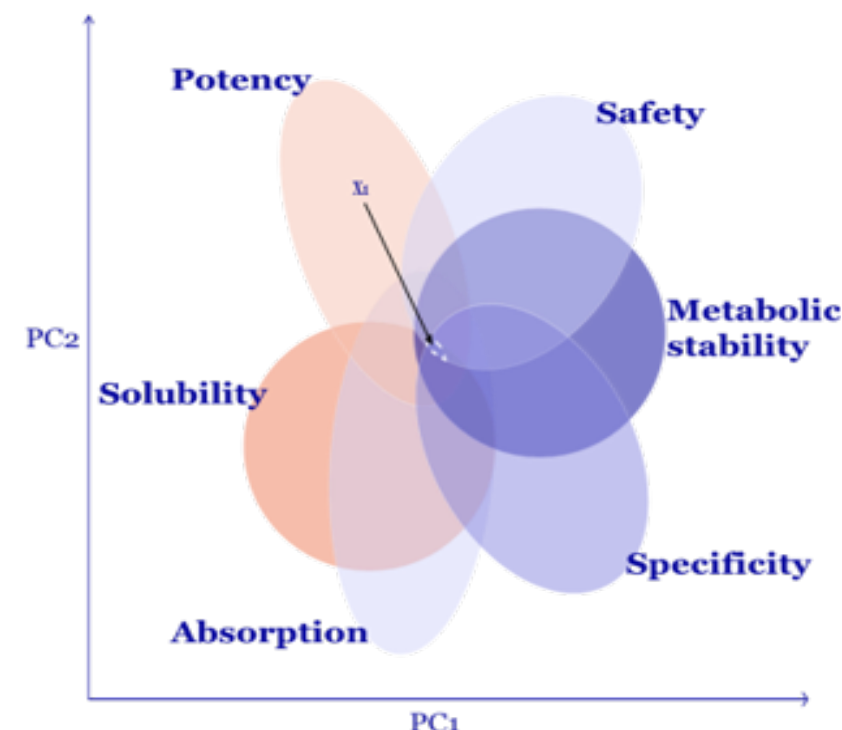
Synthesis 7 d

5-10 d

5-10 d

7-14 d

<28 d



Delineating multi-tiered readouts to maximise data-led predictions within each DMTA cycle

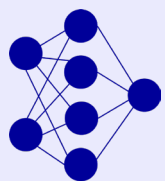


Powerful combination of AIML and efficient DMTA

Reducing timelines to candidate nomination

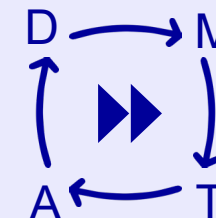
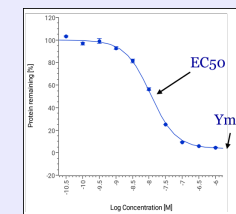
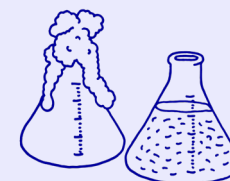
Advanced data curation and data-driven quality design

- Careful selection, cleaning and organisation of data for predictive modelling
- Data analysis and interpretation for project enablement and hypothesis generation
- Generative AI/ML & advanced computational design combined with drug hunting expertise



High-Speed Synthesis and efficient DMTA

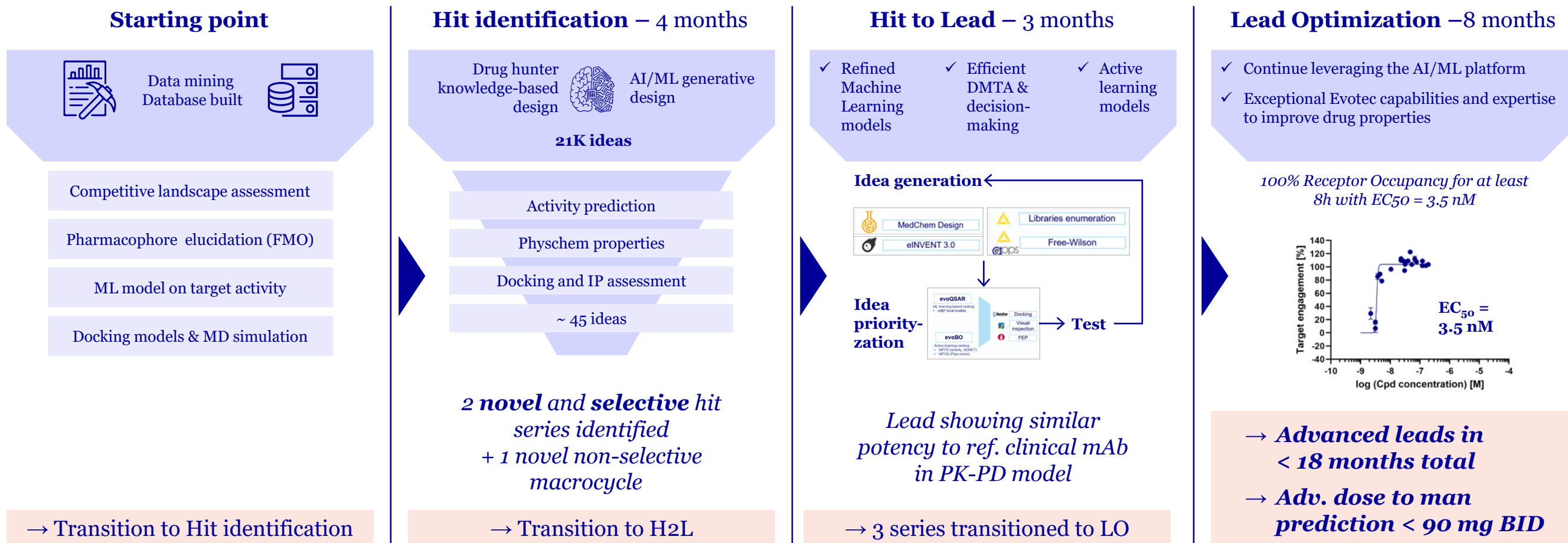
- High speed synthesis (median TAT of 7 days) supported by access to state-of-the-art synthetic technologies
- Rapid DMTA cycles are enabled by full integration of Molecular Architects, Chemistry, DMPK and Biology
- Therapeutic area and development expertise, enables accelerated progression from LO to PDC and to IND





From target to advanced leads in less than 18 months

Case study 1: integrated small molecule drug discovery

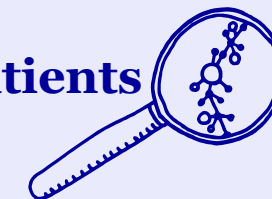


Optimal combination of drug-hunting knowledge and cutting-edge AI/ML tools led to accelerated identification of Advanced Leads

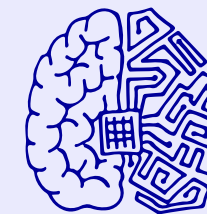


Exploring opportunities to work together to accelerate your ambition

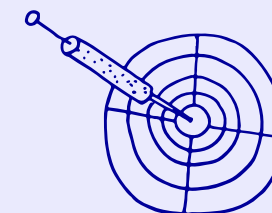
Your organization aims to accelerate drug discovery in order to provide patients with drugs which matter?



Evotec leverages data and *in silico* physics & AIML-based tools to accelerate projects in a cost-effective manner

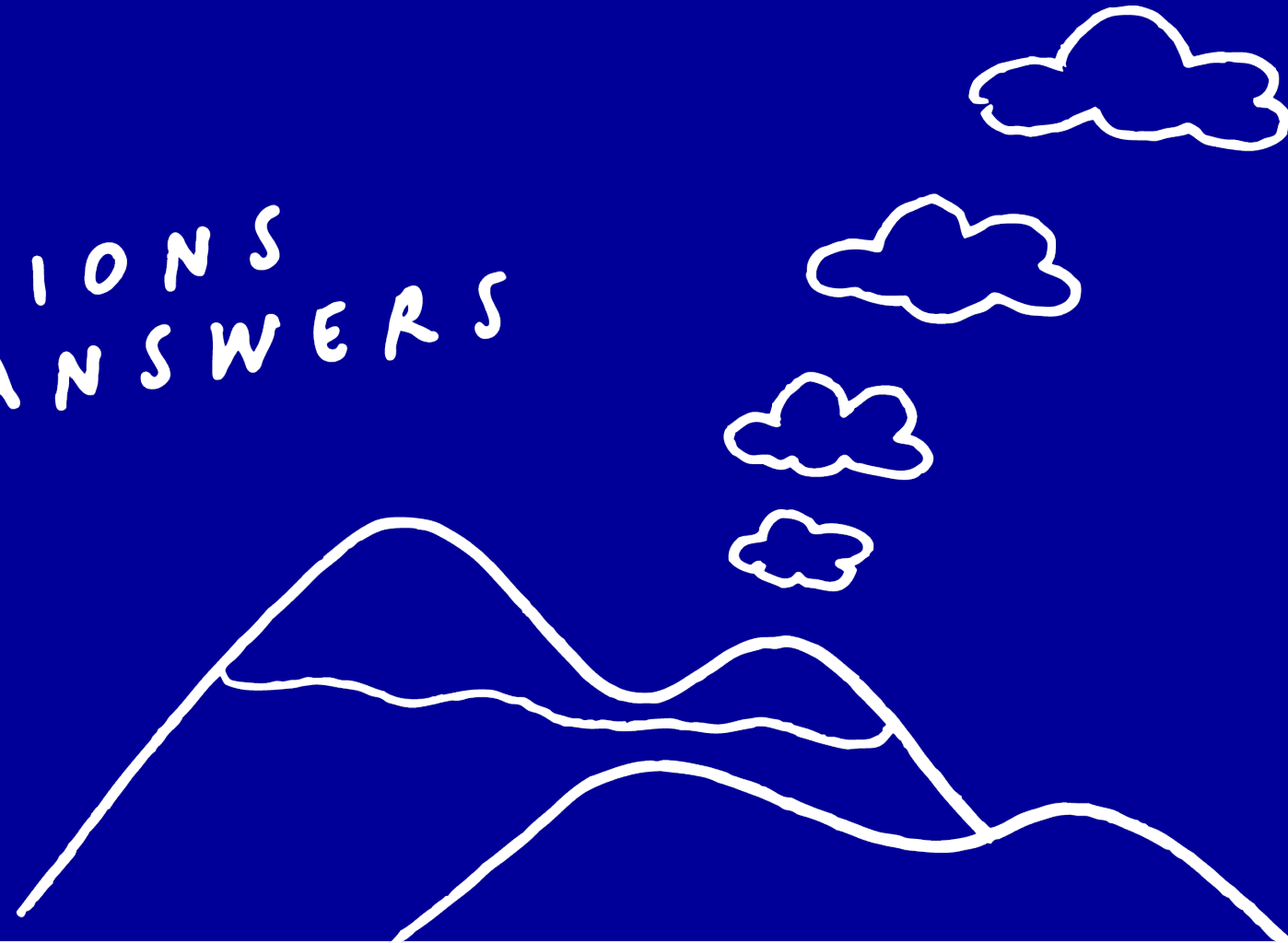


A unique opportunity for your organization and Evotec to partner towards your projects' acceleration



A powerful partnership to deliver medicines that matter to patients

QUESTIONS
AND ANSWERS



Your contact:

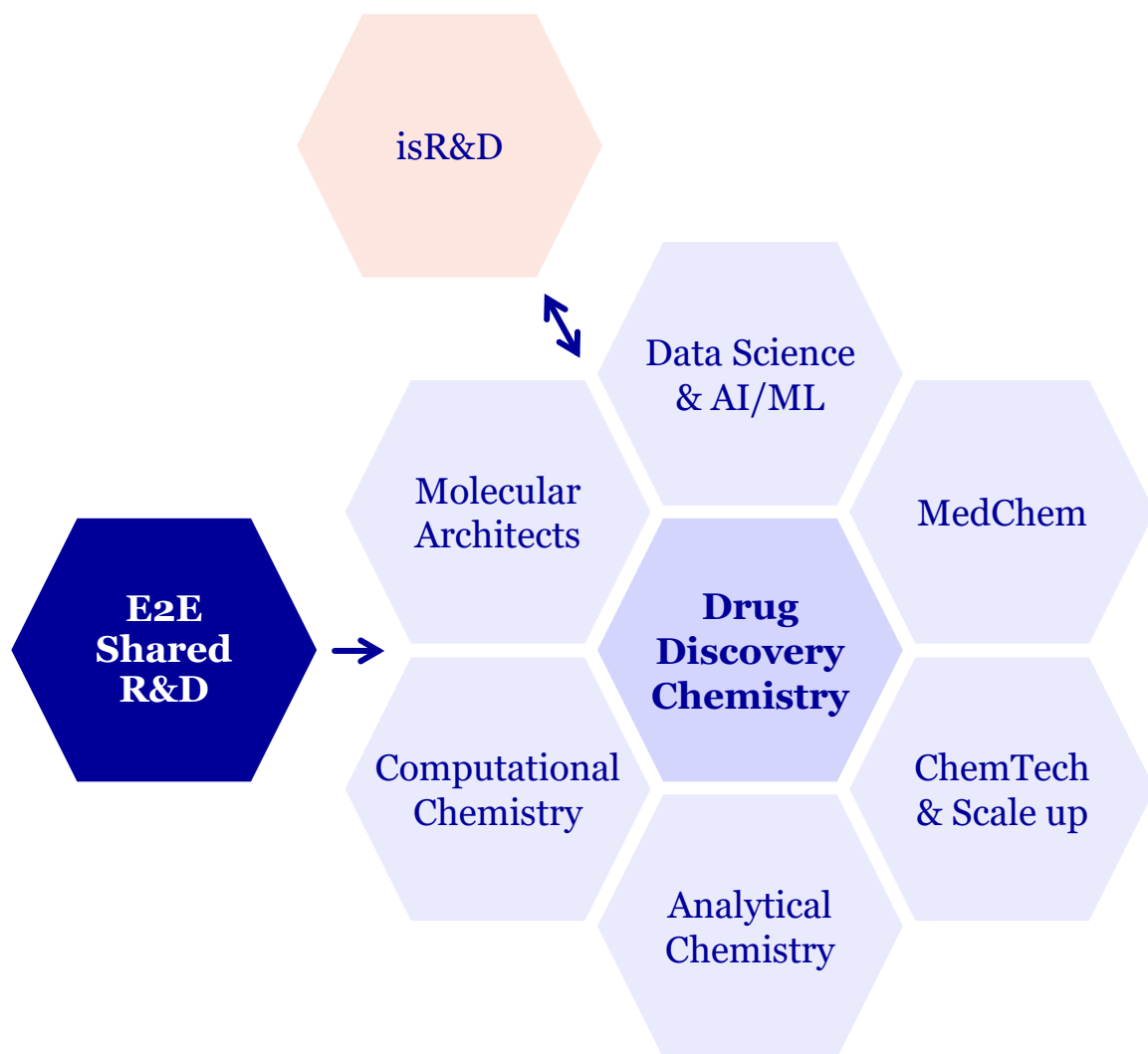
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Vice President, Head of Molecular Architects, Toulouse

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Drug Discovery Chemistry building blocks

A key component of Evotec's E2E Shared R & D continuum



Key features

- Computationally-enabled **Molecular Architects**; prediction-driven drug hunters deployed to navigate the expanding data landscape, utilising & democratising *in silico* (AI/ML) tools for rapid, enhanced design decision making
 - Goal-focused **Medicinal Chemists**; emphasis on design precision and synthesis efficiency (as part of rapid DMTA¹ approach)
 - Investment in **chemistry technologies** and innovations to accelerate new discoveries and enable difficult-to-access NME² synthesis
 - Dedicated **Discovery scale-up** teams providing “just-in-time” key intermediates and pilot compound batches and facilitating seamless exchange with API Chemistry
 - State-of-the-art **Analytical Chemistry**; supporting compound analysis, purification, characterization and specialist drug discovery applications
-
- Development of cutting-edge *in silico* predictive, generative and analytical tools in **isR&D**³



Contemporary Requirements and Toolboxes for Drug Hunters

Contemporary requirements for drug discovery

- Clear clinical line of sight
- Target validation supporting the therapeutic hypothesis
- Translational strategy
- Data-rich processes – Encode all the science relevant to the project



Data mining



The Modality toolbox

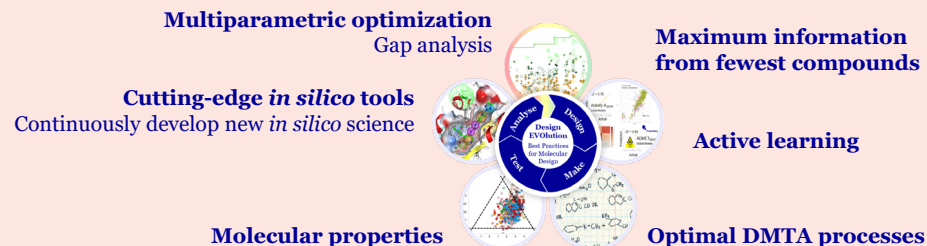
- **Small molecules** also including NPs and NP-based molecules, macrocycles, covalent, etc.
- **Gene therapy** – strong focus on delivery technologies
- **RNA molecules** – ASOs or siRNAs
- **Peptides** – including chameleonic effect
- **Antibodies** – already major actor on the drug marketplace
- **Bioconjugates** including ADCs – fantastic technological breakthroughs



The Disease-modifying toolbox

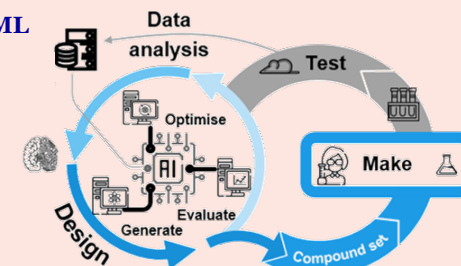
- **Targeting proteins** – modulation of the function (ortho/allosteric, PPI)
- **Targeting complex 3D-structures of RNA** – modulate the expression of the POI
- **Degrading proteins**
- Molecular Glues or Protac
- Stabilizing non-folded protein conformations
- **Etc.**

The Augmented Design Toolbox



Efficient navigation of the chemical space

AI/ML

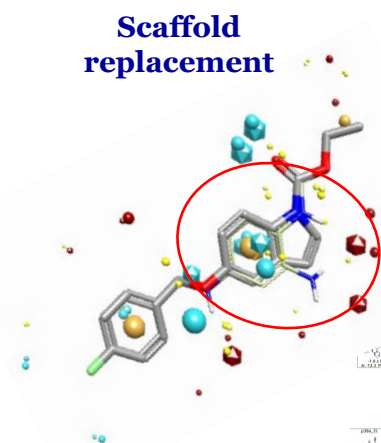
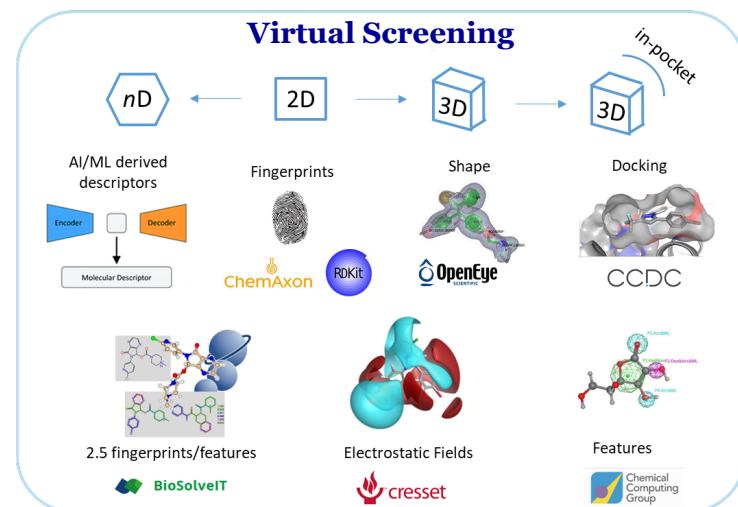


Evotec developed solutions to support all type of modalities and disease-modifying approaches

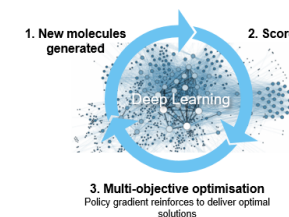
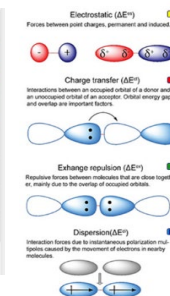
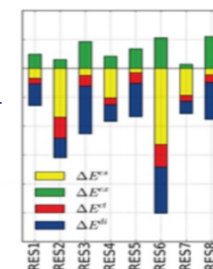


Advanced 2D- and 3D- Molecular Design at Evotec

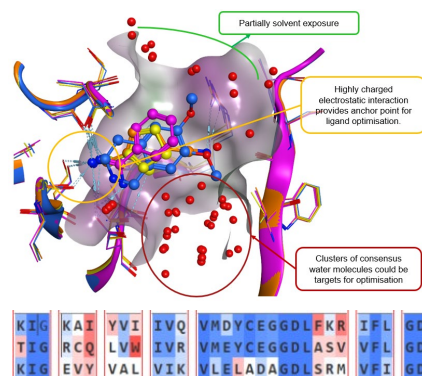
Directed by computationally-enabled Molecular Architects



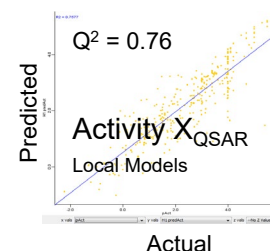
Physics-based approaches



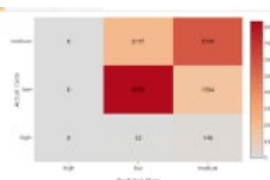
Rational Design



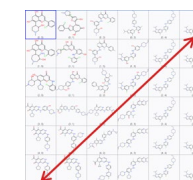
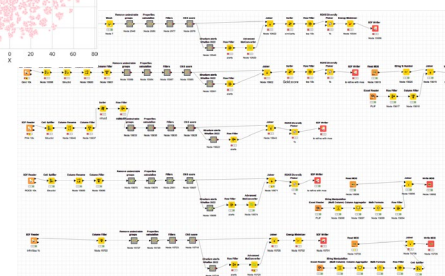
Machine Learning



Cheminformatics



Artificial Intelligence Generative design



Active Learning

- Over 45 FTEs across four sites dedicated to delivering high quality molecular drug hunting
- Comprehensive portfolio of commercial and proprietary software tools
- Appropriate deployment of *in silico* tools across the drug discovery continuum
- Vast experience with a multitude of partners over a range of target classes and therapeutic areas
- Strong partnerships across disciplines including medicinal chemistry, DMPK and structural biology

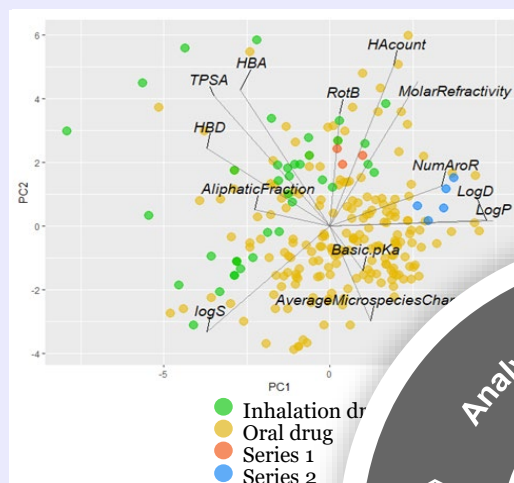


AI/ML capabilities

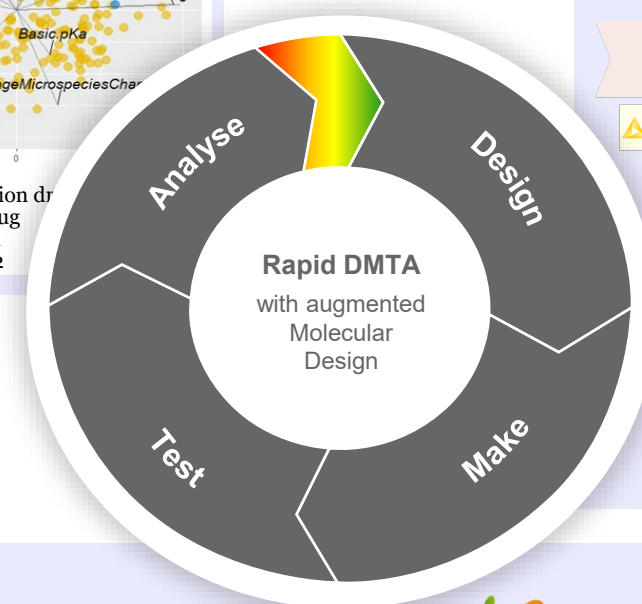
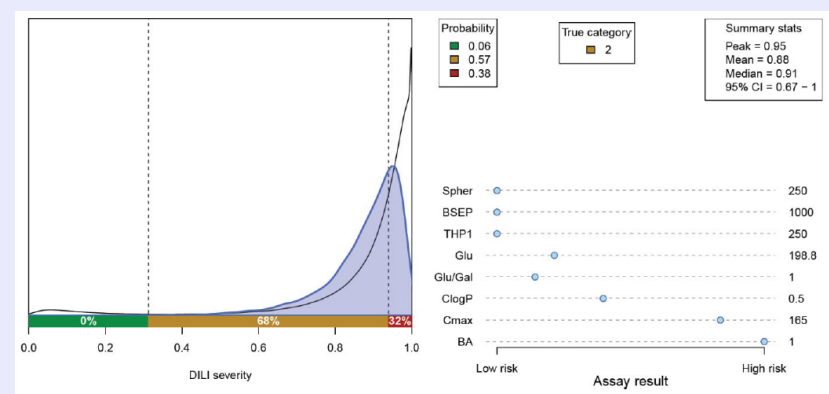
ADME(T) models for augmented DMTA cycles

Therapeutic area map (e.g CNS-map and Inhalation-map) to assess the physicochemical property space:

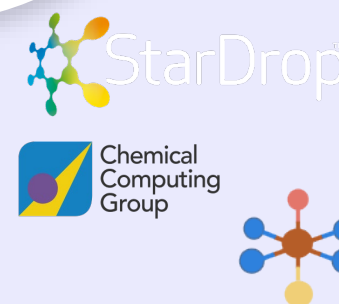
- Projection of project compounds on PCA map to understand compounds potential and type of PhysChem modulation needed



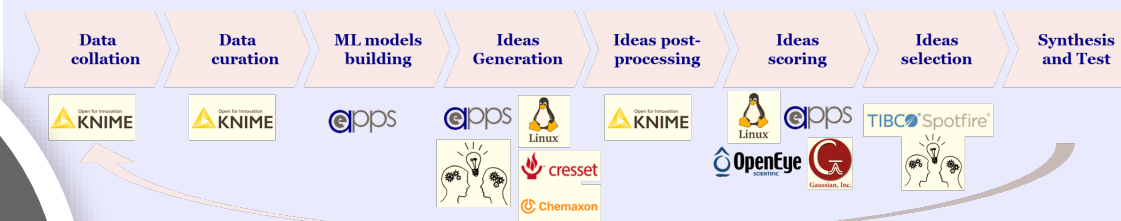
DILI risk assessment: predict risk of DILI using Bayesian Machine Learning¹



Metabolic soft-spots prediction using multiple approaches to help the design of new compounds



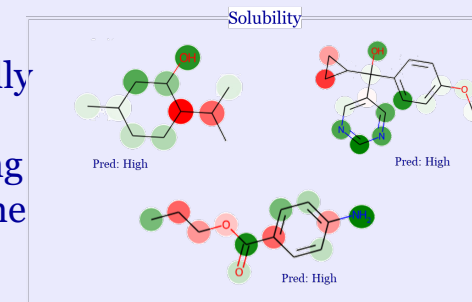
- **evoQSAR** and **evoDeep**: *in house* developed tools to build AI/ML models
 - Models can be **easily integrated** into project-specific workflows to support the design of next round of compounds



Global models using *in vitro* ADME data, available automatically through ideas&target DB and eapps, *in house* developed suite of molecular modeling tools and command line/Knime

Local models built using project-specific data

Explainable AI: xAI methods can potentially help rationalize deep (and machine) learning models and support the design of better molecules



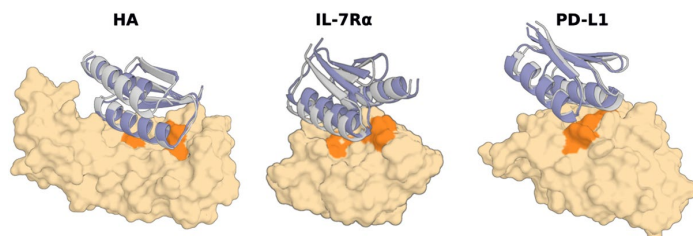


How to start a PPI project when no ligands are available?

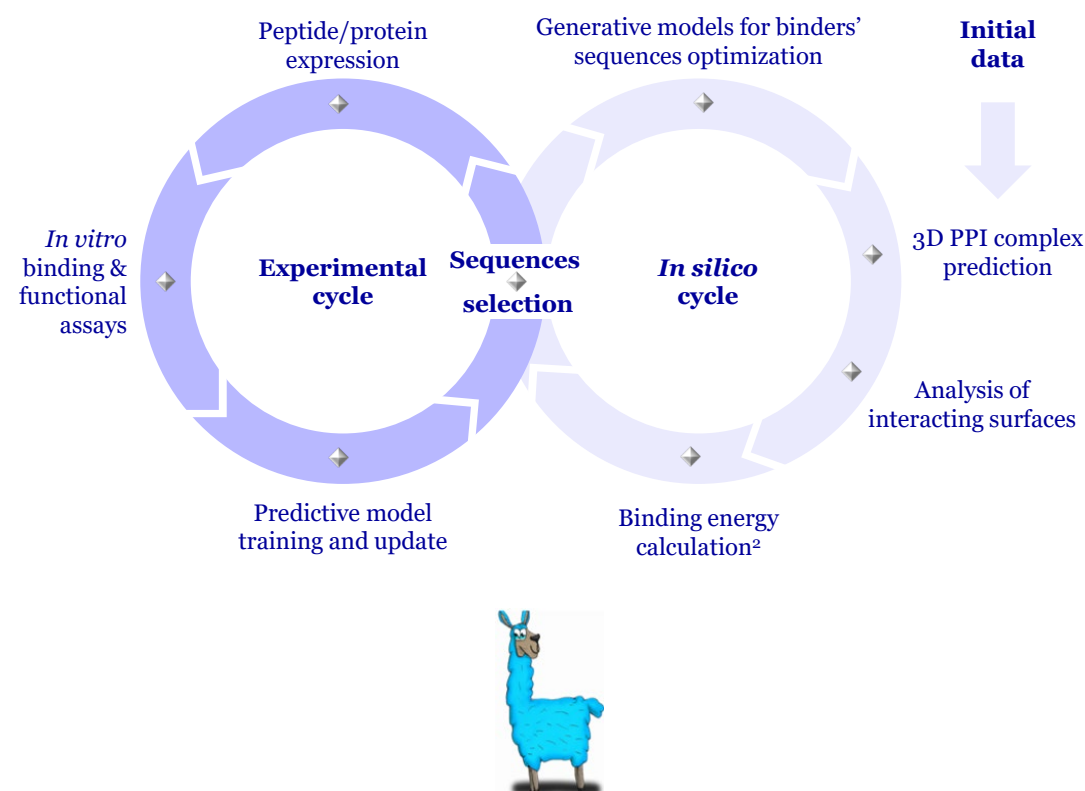
EvoLlama: design of peptides or proteins binding partners

Use of the natural PPI complex as starting point to design allosteric binders

- **3D structure prediction** of the natural protein-protein complexes using PDB structures and/or AlphaFold¹ and FoldDock¹
- **Design peptide or protein binders** with EvoLlama platform
- Combination of deep learning, machine learning and physics based computational methods



Alliance of *in silico* and *in vitro* methods



- Robust data generation to train **ML models**
- **DL-based generative and optimization models** (EvoFold, MCTS, Bayesian Optimization)
- **Established rational design methods** (FMO³, PLIF)
- No constraints on the peptide length
- Currently limited to natural a.a and linear sequences

Joint work & decision by highly skilled structural biologists, medicinal chemists and ML experts



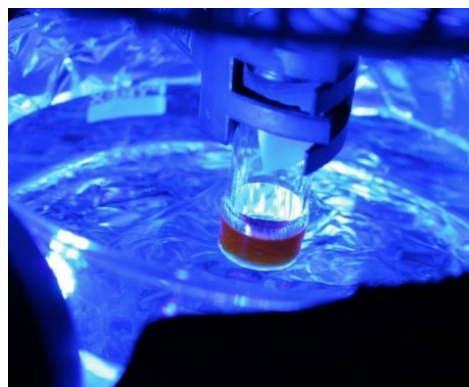
Expertise in organic synthesis

Applying the right technology to deliver the molecules that matter

Quick and easy access to the correct technology to deliver the desired compound is essential for success. Evotec has both the expertise and technology platforms to access the most challenging of targets in a rapid fashion:

Photochemistry

- Access to new and shorter chemical routes
- In-house built equipment
- In-house specialists
- Applied to multiple projects



Flow Chemistry

- Links with academic groups
- Vapourtec, H-Cube Pro & In-house built equipment
- In-house specialists
- Applied to multiple projects



Parallel / Capsules / HTE Chemistry

- Wide range of equipment available
- In-house specialists
- Several operational areas providing support
- Applied to multiple projects



Electrochemistry

- Access to new and shorter chemical routes
- IKA Electrasyn 2.0 pro providing reproducibility & standardisation
- In-house specialists



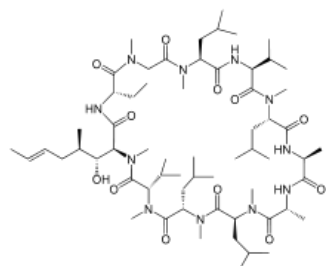


Analytical Chemistry expertise, experience and technologies

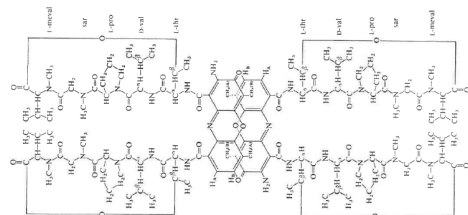
To support the End-to-End shared R&D continuum

Strong and diverse expertise combined with state-of-the-art technologies

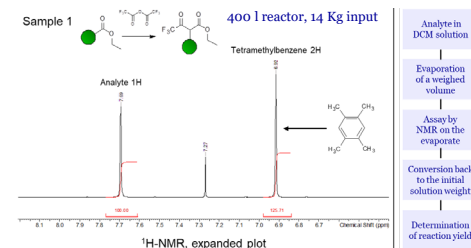
Peptides/oligos QC & purification



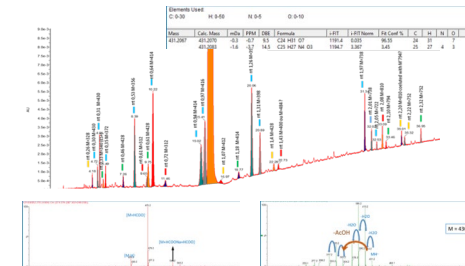
Drug self association study



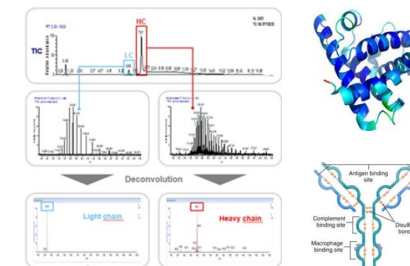
qNMR and in process control



Impurity identification



Intact mass screening



NMR up to 600MHZ



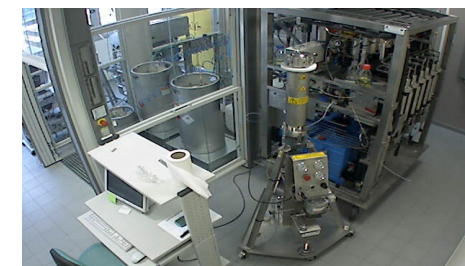
Oligos QC & purification platform



HRMS-MS



Pilot Lab: Large scale purification



Prep SFC capabilities



*Capacity: 45 analysts with analyst/bench chemist ratio 1/10.
A mix of Open-Access facilities and dedicated Analytical expertise to maximize efficiency.*



Discovery Chemistry Scale-up

A key part of the Discovery & Development Chemistry continuum

Hit ID & Lead Gen.

Lead Optimisation

IND enabling

Clinical

Market

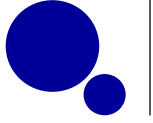


- Expertise in large-scale synthesis of intermediates and chemical developability, from g to kg scale
- Assessment of synthetic route, safety, scalability and new route development
- Full range of synthetic technologies and methodologies for reliable transfer to Development Chemistry (API)

The Discovery Chemistry Scale-up group plays a strategic role during Lead Optimisation, working in close collaboration with API Development Chemistry to ensure a smooth transition into the IND-enabling phase

Discovery Chemistry scale-up groups are available at all sites to ensure a harmonised, efficient chemistry de-risking approach





Binding site finding



Identification of shallow pocket binders for undruggable targets

	Search for	Primary objective	Hit identification strategies (in silico, experimental)	Confirm Binding site & enable SBDD	Disease-modifying approach(es)
Hetero-bifunctional approach Identify binders of the POI	Novel chemical series	<ul style="list-style-type: none">• Serendipity	Biophysical testing (ASMS, SPR, NMR, X-Ray, DEL, ...)		
	Novel chemical series <i>PDBs, AlphaFold, Ortholog, Homolog proteins</i>	Cavities/sites analysis (see next slides)	Ligand- and/or Structure-Based Virtual Screening	<ul style="list-style-type: none">• HDX• Protein observed NMR• Structural Biology	<ul style="list-style-type: none">• Protein homeostasis (if validated binders)• PPI inhibition (if validated disruptors of relevant PPIs)
	Ligands from literature related to POI or close homologs	<ul style="list-style-type: none">• Chemical starting points• Support cavity(ies) validation• Chemogenomic approach	Knowledge-based approach		
	In cell reactive cysteines (from our internal databases)	Cavity(ies) analysis	<ul style="list-style-type: none">• Covalent Virtual screening¹• Screen 5K Evotec covalent library (Intact MS and/or in cell Cysteine Protein Profiling)		
PPI inhibition	Novel chemical series	<ul style="list-style-type: none">• Serendipity	<ul style="list-style-type: none">• PPI inhibition assay (e.g. HTRF)		
	Homo-dimer analysis	<ul style="list-style-type: none">• Identify PPIs relevant to the targeted MOA/indication	<ul style="list-style-type: none">• Virtual screening• Design peptides/peptidomimetic from interactor's epitope		
	Interactome	<ul style="list-style-type: none">• FMO analysis: Identification of key PPI residues	<ul style="list-style-type: none">• De novo peptide design (EvoLlama)		

If primary objective is not met

- Small molecules targeting RNA
- ASO, siRNA

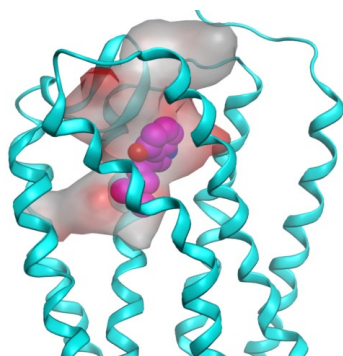


Binding sites identification at Evotec

State of the Art methods and FMO

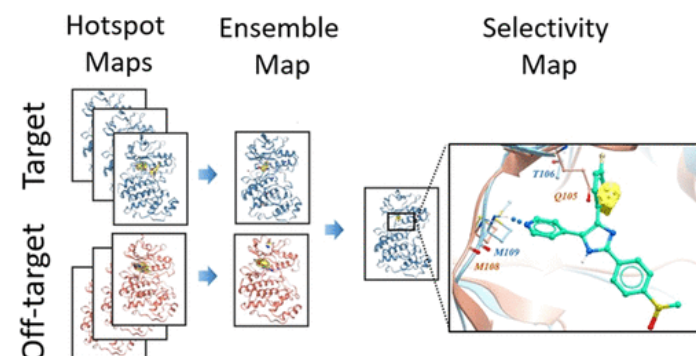
State of the Art methods

- Identification of potential active sites in targets has different applications in drug discovery:
 - **target ligandability**
 - elucidation of **protein function** and site-directed **mutagenesis** experiments
 - **virtual screening**, fragment-based **drug discovery** and **selectivity** analysis
- **Site Finder** (geometric method, CCG) and **P2rank** (ML, solvent accessible surface) are well-established tools that calculate potential active sites
- **Fragment Hotspots Mapping** (CCDC)¹ identify key interactions in ensembles of structures of the same protein (donor, acceptor, hydrophobic).



Site Finder

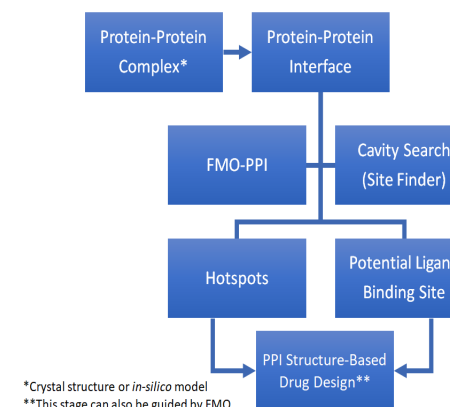
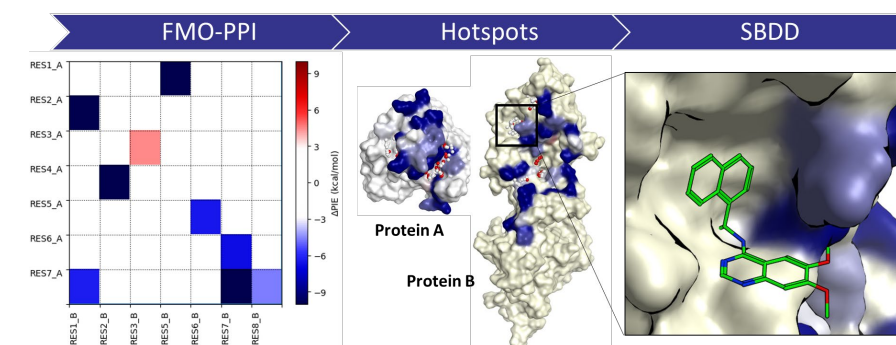
detected pocket in serotonin receptor. Agreement with the site described for psychedelic analogs.



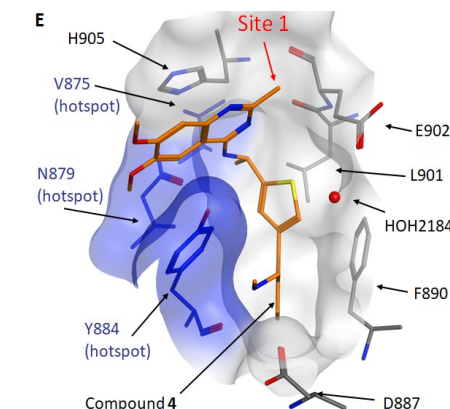
Fragment Hotspots Mapping

FMO guided SBDD for Protein-Protein Interactions

- Although **PPI interfaces** are large, a small molecule / peptidomimetic modulator / small peptide only needs to exploit **key 'hotspots' to modulate the interaction**
- We have developed a workflow deploying the FMO methodology to understand and capitalize on **PPI interaction hotspots to guide SBDD**²



*Crystal structure or *in-silico* model
**This stage can also be guided by FMO



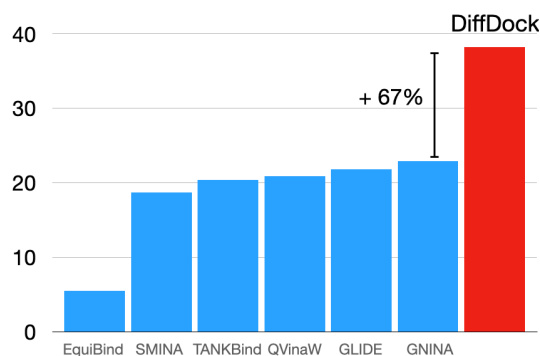


Binding sites identification at Evotec

Diffdock and PocketMiner

Diffdock¹ (generative model based on diffusion)

- State-of-the-art on blind docking results¹
- Diffdock allows multiple positions and poses to be generated
- Trained on a large number of protein-ligand pairs
- The model is able to identify multiple binding sites
- It uses two models:
 - generates multiple conformations in multiple sites
 - ranks the poses according to a confidence model



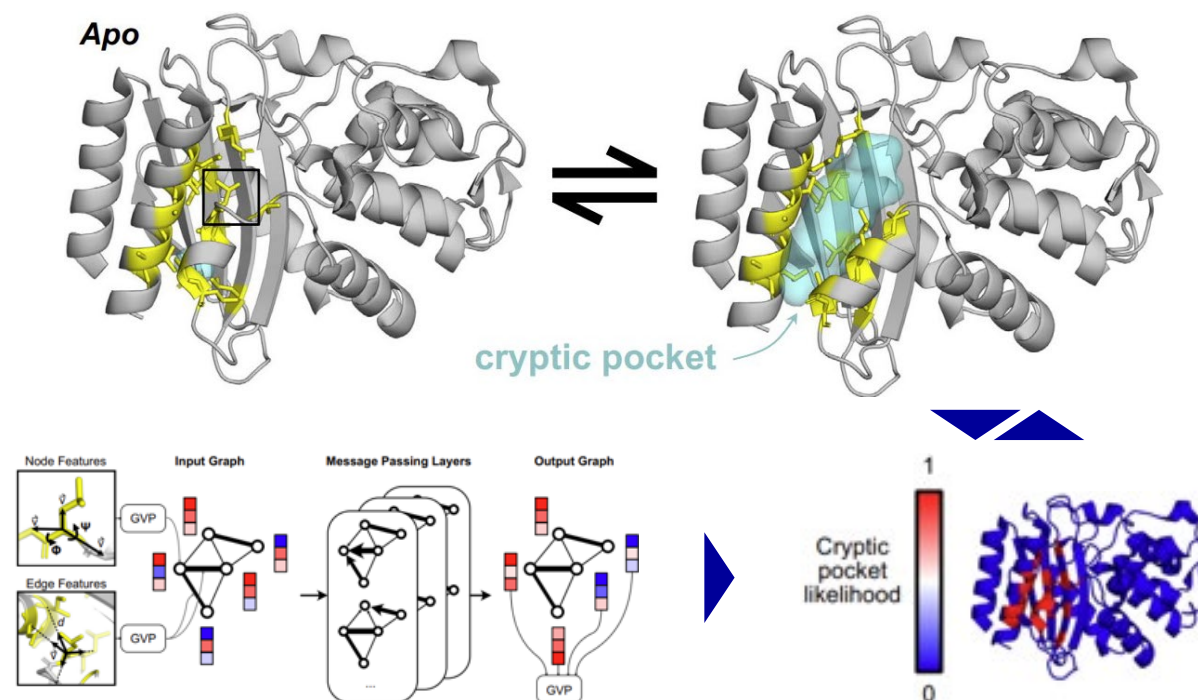
PDBBind blind docking: % complexes w/ RMSD < 2Å



- 38% Top-1 prediction with RMSD < 2Å on PDBBind
- Significantly outperforms traditional docking (23%) and deep learning (20%) methods

PocketMiner²

- Cryptic pocket formation likelihood: a graph neural network predicts where pockets are likely to open in molecular dynamics simulations
- Evaluates if each residue can rearrange as part of its thermal fluctuations
 - Does not necessitate existing ligands
 - Trained on examples of pocket opening events





Binding sites identification at Evotec

α/β domains switchability for *in-silico* discovery of allosteric sites and modulators

- **Switchability**

- Some protein segments can SWITCH their Secondary Structure between HELIX and STRAND → Ambivalent / Switchable segments

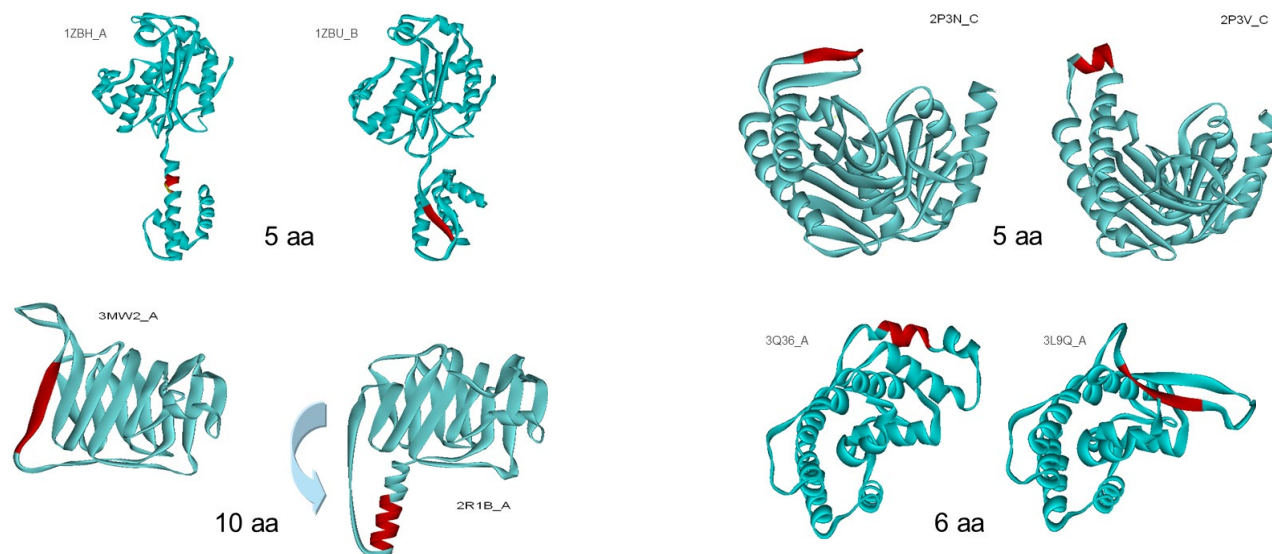
- **Allosteric modulation**

- The switch, or the selection of a structure, may be favored by the binding of a modulator

- **Advantages**

- Allosteric modulation → Higher specificity
- New compounds classes → Patents

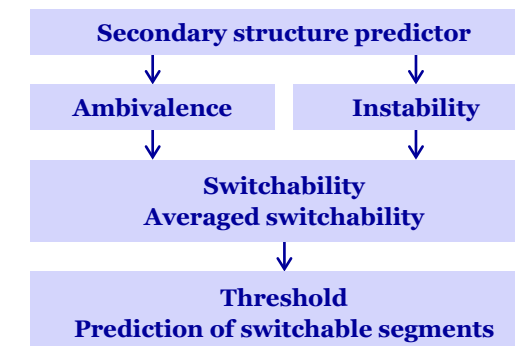
Examples of switched structures¹ in the PDB



Algorithm for predicting α/β switches

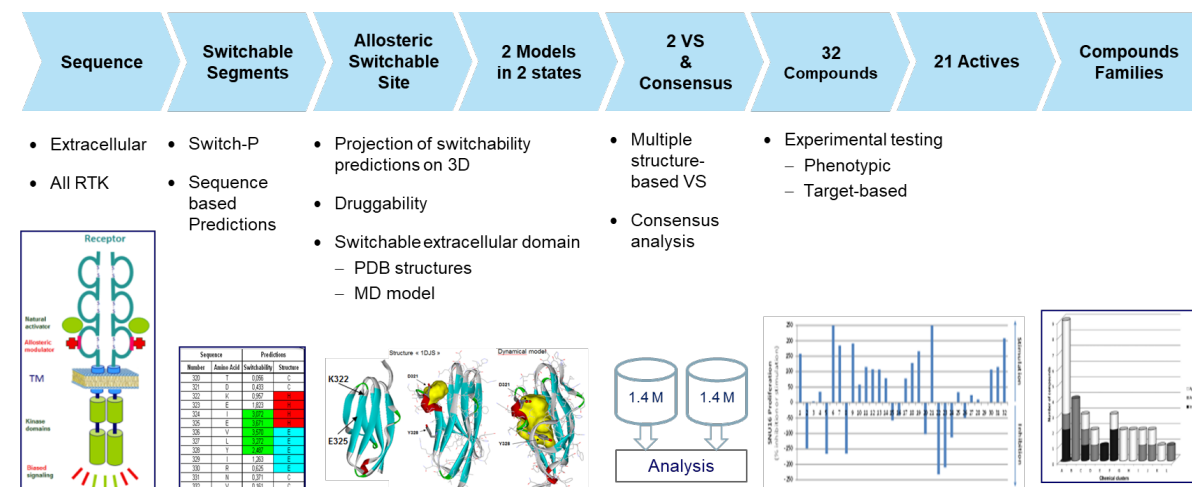
SWITCH-P: sequence-based switchability predictor

- 1) Secondary structure predictor
- 2) Ambivalence: Static property (wild-type)
- 3) Instability: Dynamic property (mutations)
- 4) Switchability & averaged switchability
- 5) Threshold & prediction of switchable segments



Example

Virtual screening on an α -helix to β -strand switchable region of the FGFR2 extracellular domain revealed positive and negative modulators²

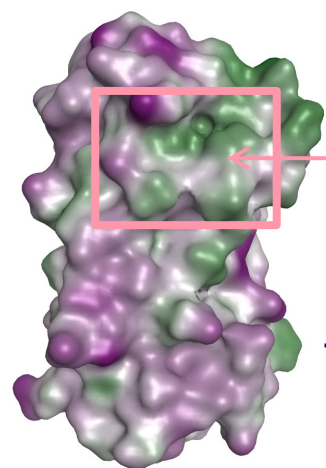




Molecular Dynamics (MD) for cryptic site search

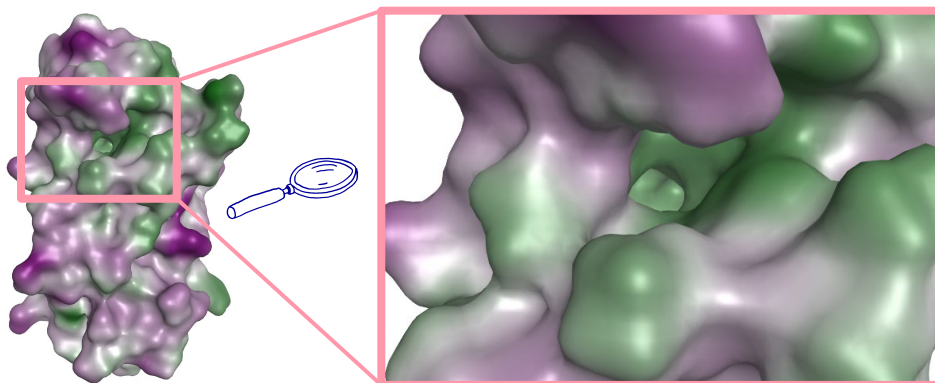
A test case: NPC2 protein: water, mixed and organic solvents MD

PDB entry 1NEP, **Apo**
starting structure (for MD)

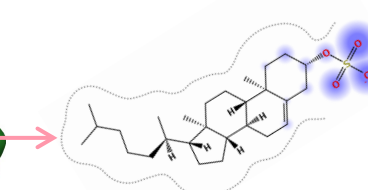
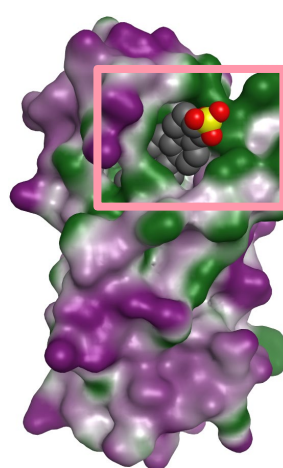


The cryptic site
is not visible nor
detectable by
software

After ~600 ns of MD of
the Apo PDB, a deep
pocket is visible and well
discovered by site
detection software tools

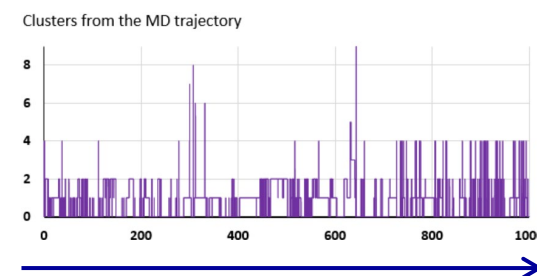
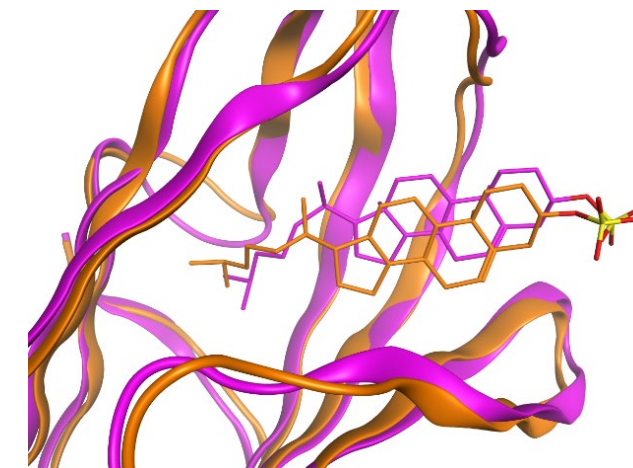


Holo PDB entry 2HKA
(for comparison)

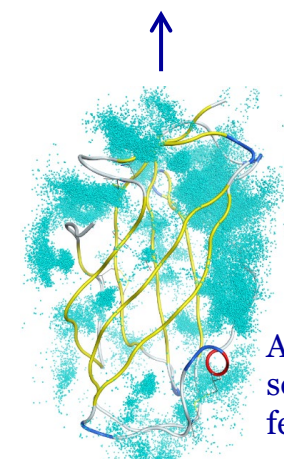


Cholesterol sulfate
in a deep buried
lipophilic pocket

Best docking pose from MD snapshot
aligned with **Holo** pdb 2HKA



Clusterings, Representatives,
Docking, Scoring, Pose analysis



An organic
solvent pre-
ference map



Evotec proprietary small molecule-targeting RNA design platform

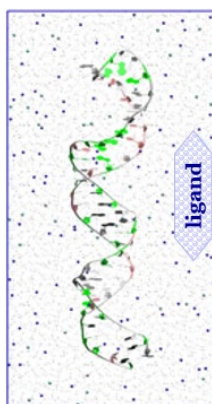
From 3D Modeling to Virtual Screening

3D structure determination

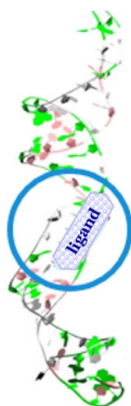


Atomic solution model
generated at Evotec

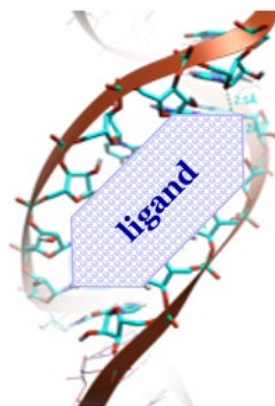
Pocket Search



Pocket identification

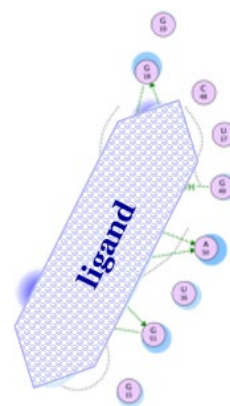


Potential Binding mode



Binding Mode-1
(~600ns)

RNA-Ligand interaction map



- Validated binders fit well
- Non-binders show poor fit
- Model able to discriminate

MD simulations

- X'-UTR RNA 3D Structure + Ligand (Random placement)
- FF parameters
- Charge Neutral [buffer conditions]
- Periodic Boundary Conditions + Particle Mesh Ewald
- Microsecond time scale simulations
- Clustering and pocket prioritization

Molecular Docking

- Docking in consensus pocket found via MD
- Full parametrization of compounds
- Pre-alignment and docking
- Docking pose rescoring

Ongoing assessment and implementation of published tools/methods

Identifying small-molecules binding sites in RNA conformational ensembles with SHAMAN
Panei et al;
Integrated Drug Discovery, Molecular Design Sciences, Sanofi, Vitry-sur-Seine, France
Institut Pasteur, Université Paris Cité, CNRS UMR 3528, Structural Bioinformatics Unit, Paris, France

Predicting Small Molecule Ligand – RNA Binding Pocket Binding Modes Using Metadynamics

Zhixue Bai¹ and Alan Chen^{1,*}

¹Department of Chemistry and the RNA Institute, University at Albany, State University of New York, Albany, NY, 12222, USA

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Article

Mechanism of Ligand Binding to Theophylline RNA Aptamer

Sana Akhter, Zhichao Tang, Jinan Wang, Mercy Haboro, Erik D Holmstrom, Jingxin Wang,*
and Yinglong Miao*

Cite This: <https://doi.org/10.1021/acs.jcim.3c01454>

Read Online



Briefings in Bioinformatics, 2023, 24(4), 1–11

<https://doi.org/10.1093/bib/bbad187>

Advance access publication date 18 May 2023

Problem Solving Protocol

Structural interaction fingerprints and machine learning for predicting and explaining binding of small molecule ligands to RNA