Protein-ligand complexes

Outline

- Biological relevance

- Molecular recognition

- Structure of complexes

- Protein druggability

- Small molecules

- Molecular docking

- Evaluation of complexes

- Transport of small molecules

Biological relevance

- **Cell signaling & regulation**

  - binding of small molecules to receptors

    - molecular function of ligands/receptors

    - selectivity of receptors

  - transport mechanisms

  - homeostasis of the cell

  - …
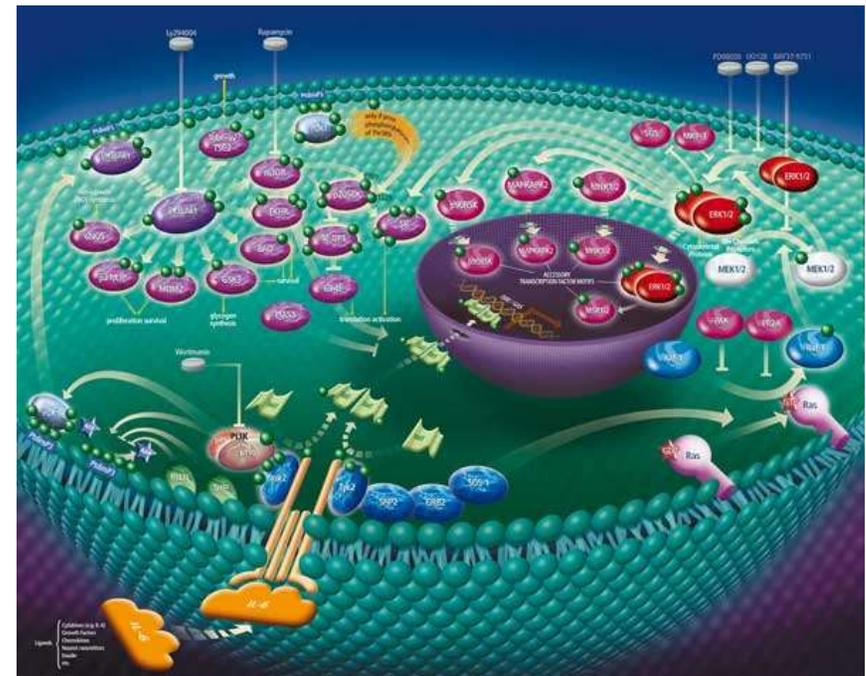
Biological relevance

- **Metabolism**

  - binding of small molecules to enzymes

    - molecular function of enzymes

    - activation of enzymes and molecular pathways

    - bioactivation and clearance of drugs and xenobiotics (P450s,…)

    - enzymatic cascades

    - metabolic interferences (competing pathways)

    - …

Biological relevance

- ❑ **Drug discovery**

  - ▪ binding of small molecules drug targets (enzymes, receptors, …)

    - ▪ identification of possible inhibitors

    - ▪ optimization of inhibition

    - ▪ repurposing of drugs – finding new receptors

    - ▪ adverse side-effects due to binding to other target

    - ▪ …
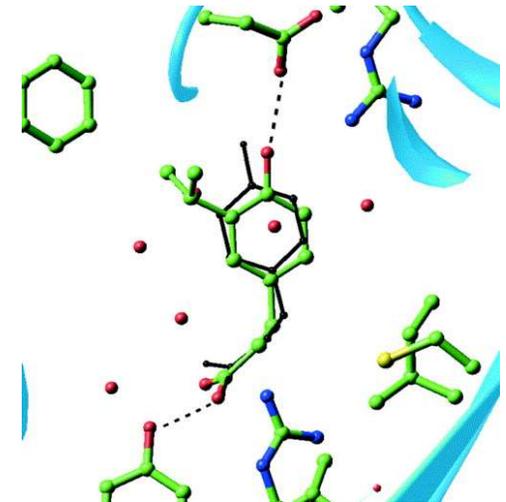
Biological roles

☐ **Binding**

- specific binding governed by complementarity

    - shape – non-polar interactions

    - physicochemical – electrostatics and polar interactions

TATA binding protein

Myoglobin

Histone octamer
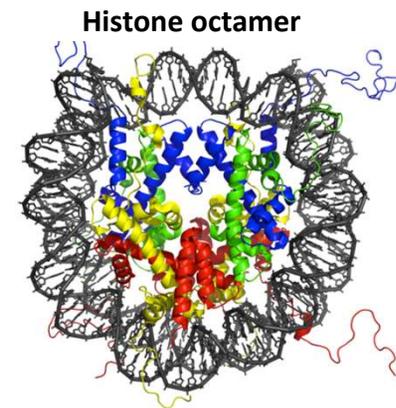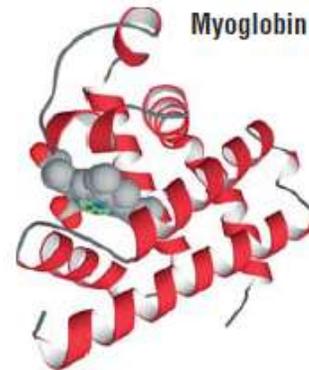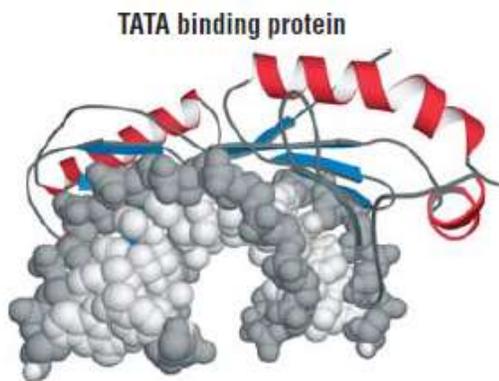
Biological roles

❑ **Catalysis**

■ chemical reactions can be accelerated by 17 orders of magnitude

■ transition state stabilization

■ tight binding decreases the energy barrier of the reaction

HIV protease

DNA polymerase

Hammerhead ribozyme
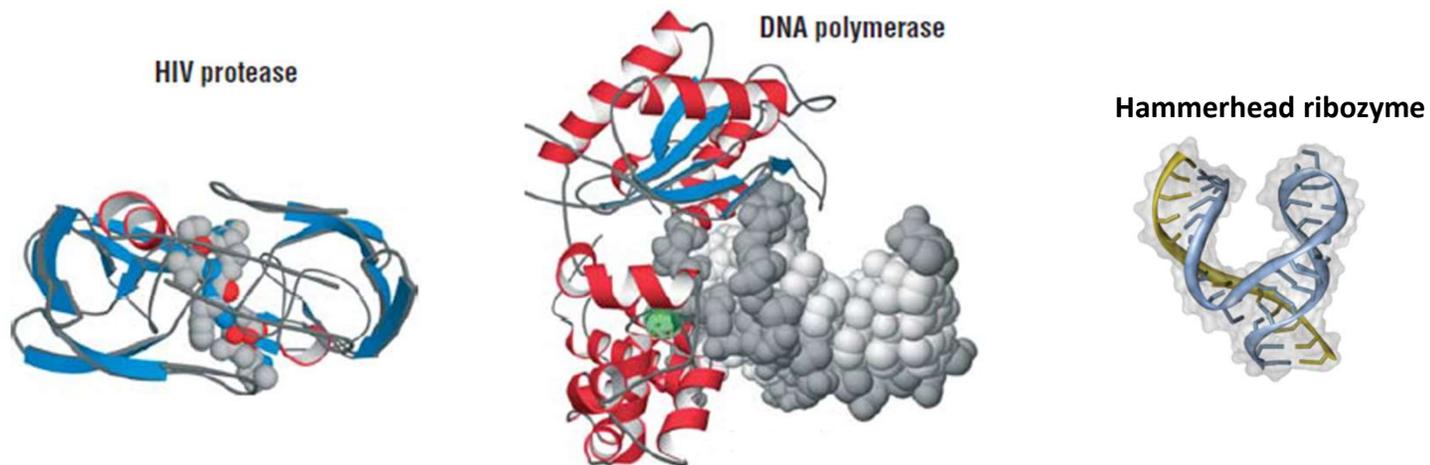
Biological roles

- **Signaling**

  - conformational changes in response to

    - ligand binding

    - properties of surrounding environment (pH, forces...)

  - different conformations recognized by different proteins in signaling

  pathways -> control of cellular processes

Ras "off" Ras "on" Guanine riboswitch
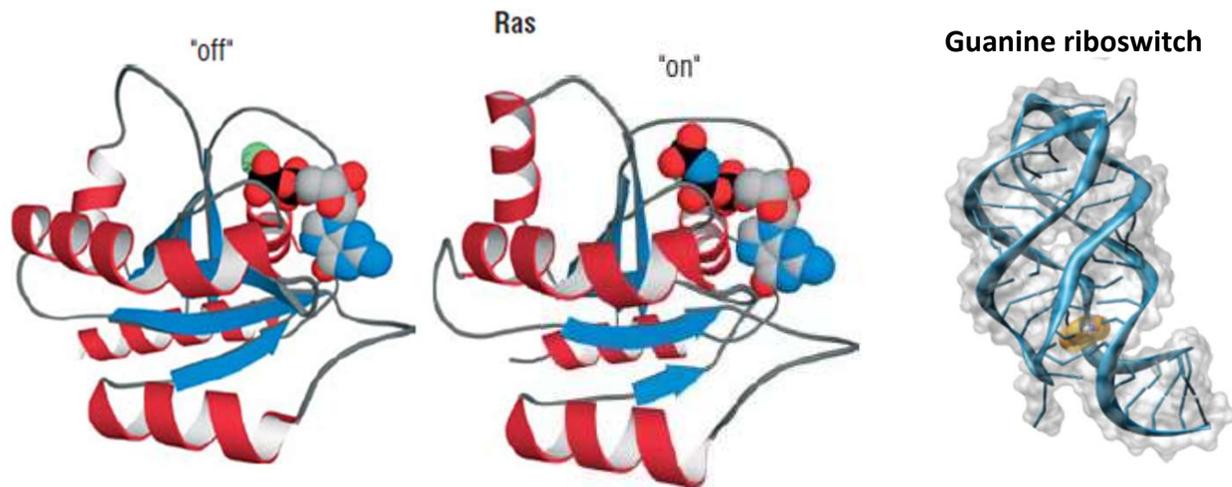
Biological roles

- **Formation of complex structures**

    - structural element of complex systems

    - governed by specific association of protein subunits

        - with themselves

        - other proteins, carbohydrates, lipids, …


Silk

F-actin
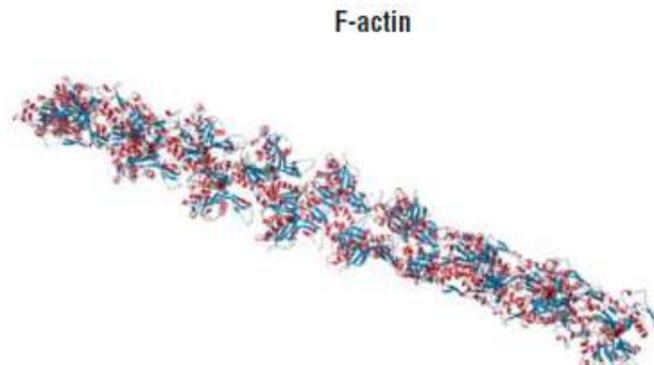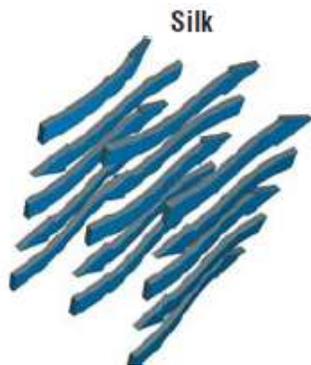
Molecular recognition

- molecular recognition refers to the specific interactions between two or more molecules through noncovalent bonding

- different biological roles

  - specific binding

  - catalysis

  - signaling

- several models to explain recognition

Lock-and-key model

- **E. Fisher – 1894**

- Complementarity between receptor's binding site and ligand moiety
  - size & shape
  - physicochemical properties
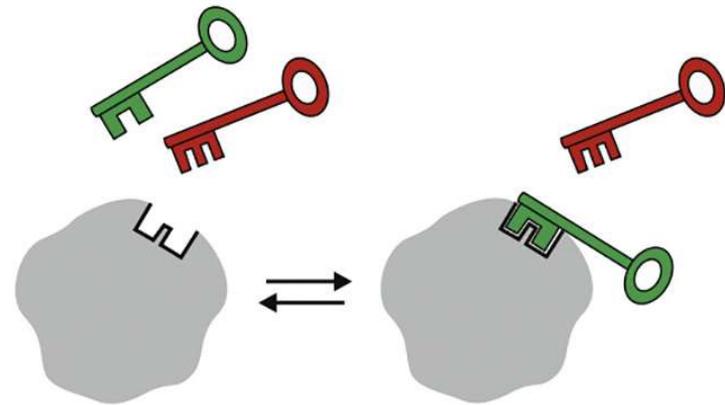
- Both ligand and receptor are considered rigid
  - not sufficient to explain allostery, non-competitive inhibition, or catalysis
  - -> model dismissed, only used for educational purposes

Induced-fit model

- **D. E. Koshland – 1956**

- Only partial complementarity necessary
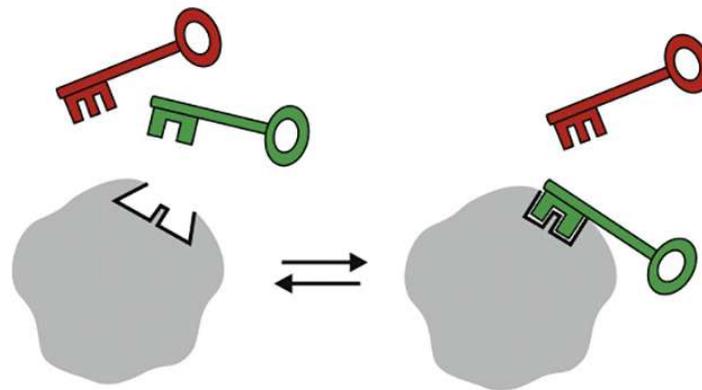
- Both ligand and receptor can undergo conformational adjustments upon complexation

  - conformation of the bound receptor does not exists in its free state

Selected-fit model

- **B. F. Straub – 1964**

  - this model is also called: conformational selection, fluctuation-fit
    or population selection

- Receptor and ligand flexible -> considered as ensembles
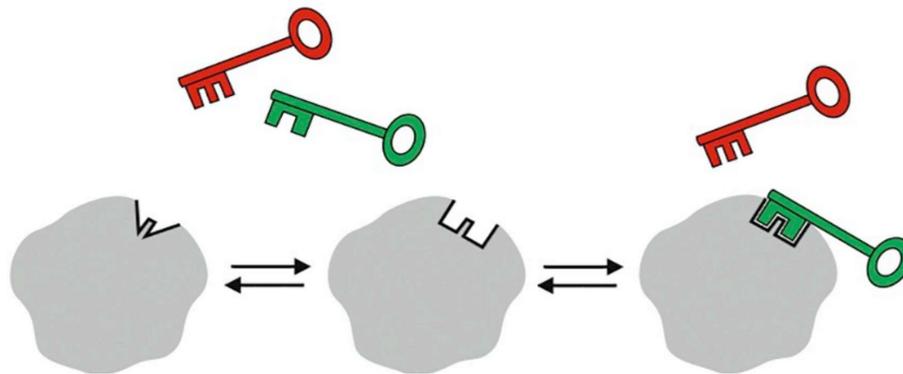
- Complex is formed in a lock-and-key fashion when two
  complementary configurations occur

  - conformation of the bound receptor exists also in its free state

Biocatalysis

- Enzymes increase the speed of chemical reactions by decreasing the activation barrier
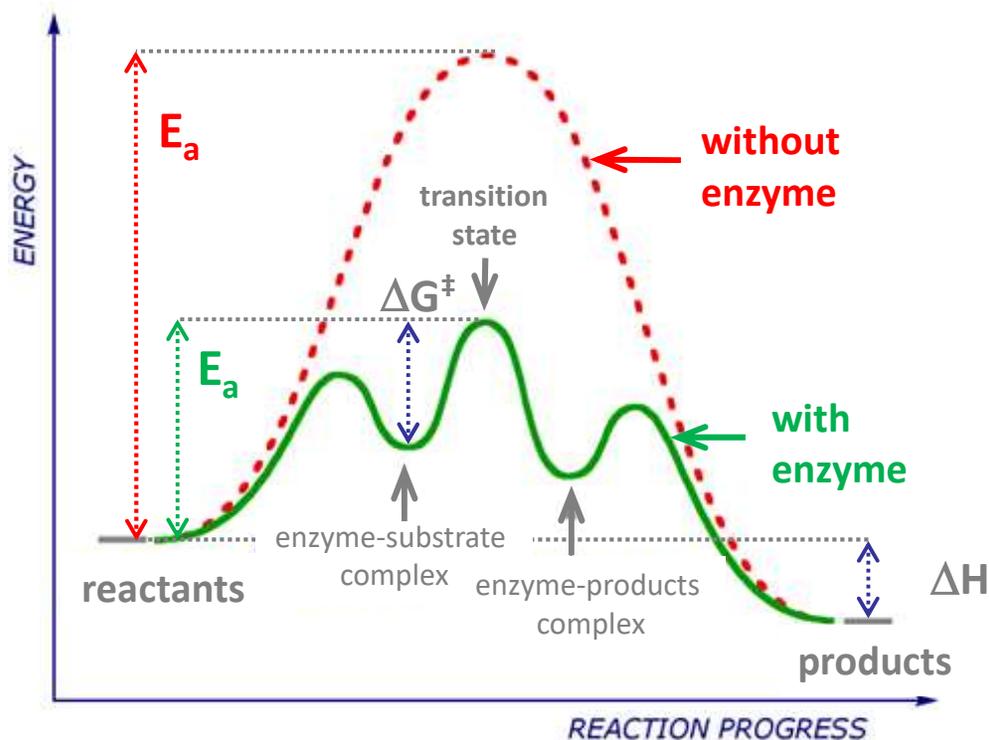
- Kinetic rate:

$$k = Ae^{\frac{-E_a}{RT}}$$

(Arrhenius equation)

- lower E_a → higher k

⇔ faster reaction

Biocatalysis

❑ Enzymes increase the speed of chemical reactions by decreasing the activation barrier

❑ Provide environments that stabilize the transition state(s)
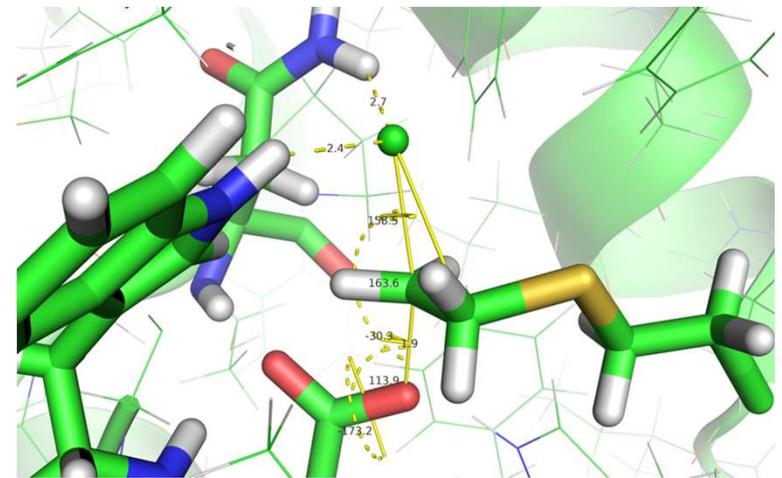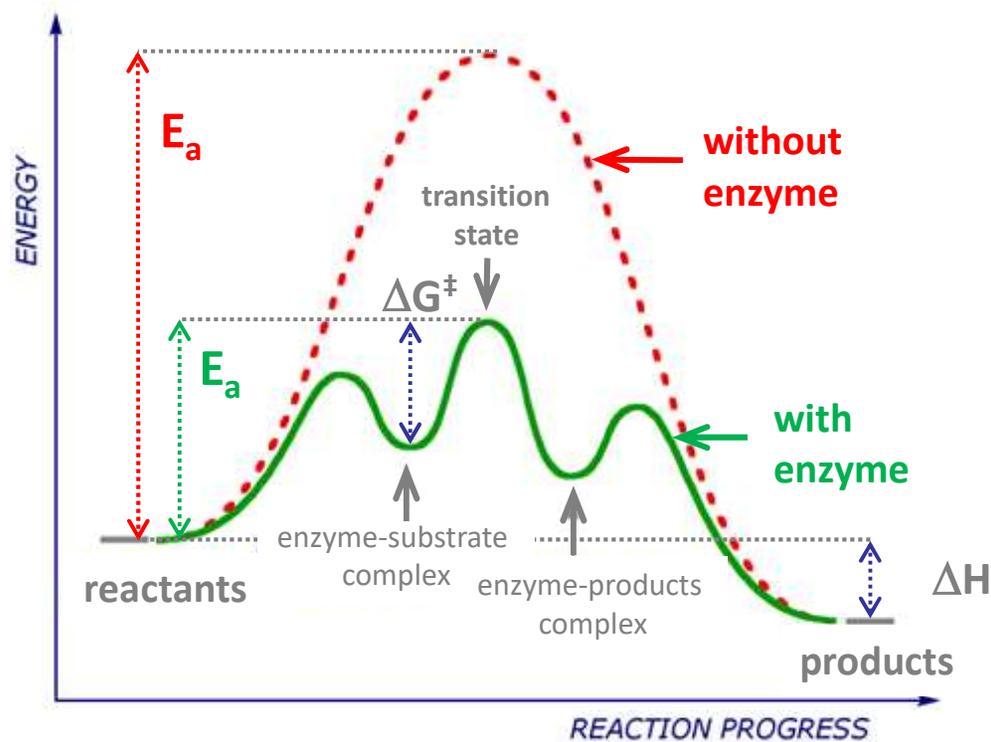
Structure of complexes

- Complexes in RSCB PDB

- Databases of complexes

  - PDBbind

  - BindingDB

  - ChEMBL

  - …

Complexes in RSCB PDB

- **Limited number of available complexes**

  - 135,000 protein structures

  - 101,000 structures with ligands

- **Limited information on conformation of bound ligand**

  - ligands often quite mobile -> uncertainties -> need to be verified

Databases of complexes

❑ **PDBbind**

- ▪ http://www.pdbbind.org.cn

- ▪ binding affinity data and structural information on about 16,500 complexes

  - ▪ ~ 13,500 protein-ligand

  - ▪ ~ 120 nucleic acid-ligand

  - ▪ ~ 800 protein-nucleic acid

  - ▪ ~ 2,000 protein-protein complexes

- ▪ data collected from >29,000 original references

- ▪ provides also "refined set" and a "core set" compiled as high-quality data sets of protein-ligand complexes for docking/scoring studies

Databases of complexes

❑ **PDBbind**

Databases of complexes

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Databases of complexes

❑ **BindingDB**

- www.bindingdb.org

- focus on the interactions of protein considered to be drug-targets with drug-like molecules

- contains about 1,500,000 entries of binding data

  - 7,000 protein targets

  - 650,000 small molecules

- crystal structures of complexes with measured affinity

  - ~2,500 - for proteins with 100% sequence identity

  - ~ 6,000 - for proteins up to 85% sequence identity

Databases of complexes

- **BindingDB**

Databases of complexes

❑ **BindingDB**

Databases of complexes

❑ **ChEMBL**

- https://www.ebi.ac.uk/chembldb/

- is a manually curated database of bioactive molecules with

    drug-like properties

- database of binding, functional and ADME (Absorption, Distribution, Metabolism, and Excretion) and Toxic. information

- contains nearly 15,000,000 activity data

    - ~12,000 protein targets

    - ~1,700,000 distinct small molecules

- data collected from >67,000 original publications

- intelligent clustering of relevant information

Databases of complexes

❑ **ChEMBL**

Databases of complexes

❑ **ChEMBL**

Databases of complexes

❑ **ChEMBL**

Protein druggability

□ **Druggability** = likelihood of finding bioavailable, selective, low-molecular weight molecules that bind with high affinity to the pharmacological target

Drug Discovery Today
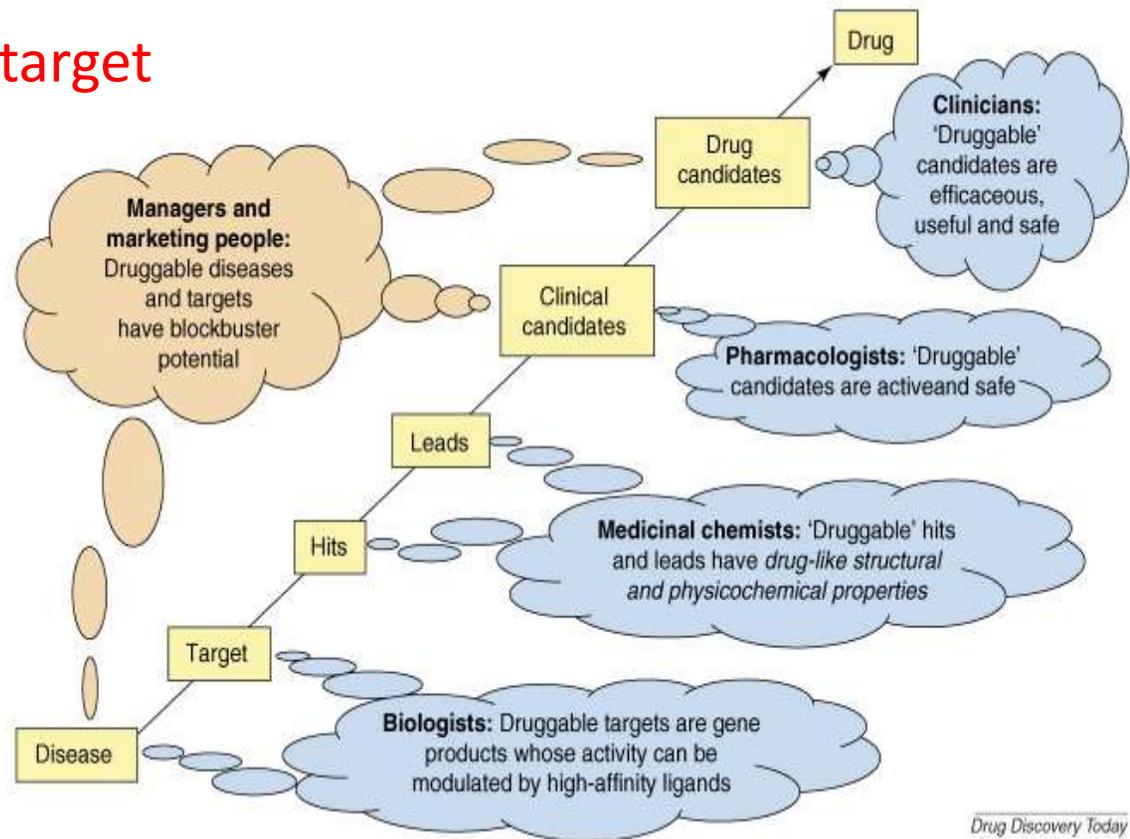
Protein druggability

- **Prediction of protein druggability**

  - by similarity to known target

    - sequence of binding domain

    - structure of binding site

  - from databases of known targets

  - using predictive web servers

- **Unfortunately, many resources are only private or commercial**

Protein-ligand interactions server

❑ **Proteins *Plus***

- https://proteins.plus/

- provides global support for the initial steps of dealing with protein structures

- structure search, quality assessment, protein pocket detection, protein-ligand and protein-protein interactions

- predicts binding sites and estimate their druggability

Small molecules

- ❑ Representation of small molecules

- ❑ Databases of small molecule

  - Cambridge Structural Database

  - PUBCHEM database

  - ZINC database

- ❑ Preparation of small molecule structure

Representation of small molecules

- ❑ 1D – atom based (empirical formula)

    - ▪ C_2H_5Cl

- ❑ 2D – chemical structure diagram -> connection

    - ▪ topology or SMILES (Simplified Molecular Line Entry System)

 $\longrightarrow$ CCCl

 $\longrightarrow$ C1=CC=C(C=C1)CN
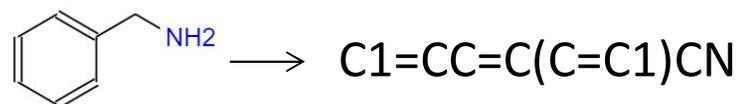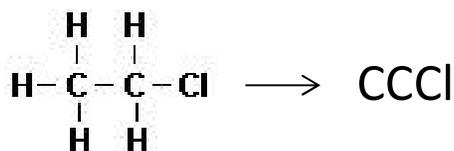
- ❑ 3D – atomic coordinates

    - ▪ usually: PDB or MOL2 files
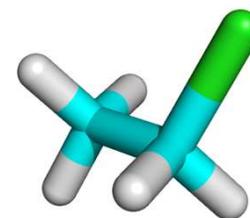
- ❑ Beware: may have different protonated states

Acids: ⇌   Amines ⇌

pH < 4.75   pH > 4.75   pH < 10.8   pH > 10.8

Databases of small molecule

❑ **Cambridge Structural Database**

- http://www.ccdc.cam.ac.uk/products/csd/
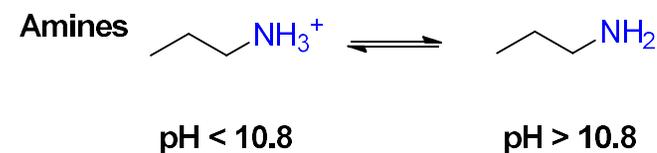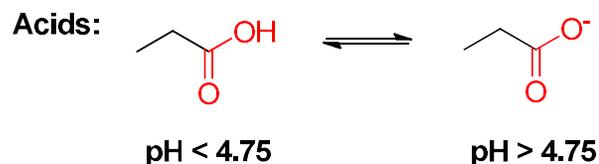
- the world largest repository of small molecule crystal structures

- >900,000 structures with 3D coordinates available

- CSD is distributed commercially

- free interactive demo for educational purposes (only ~750 structures)

  - https://www.ccdc.cam.ac.uk/Community/educationalresources/teaching-database/

Databases of small molecule

❑ **Cambridge Structural Database**

Databases of small molecule

- ❑ **PubChem**

  - ▪ http://pubchem.ncbi.nlm.nih.gov/

  - ▪ world largest open repository of experimental data identifying the biological activities of small molecules

  - ▪ **Substances** – 270 M chemical entities

  - ▪ **Compound** – 111 M unique chemical structures. Compounds may be searched by chemical properties and are pre-clustered by structure comparison into identity and similarity groups

  - ▪ **BioAssays** – ~1,4 M biological experiments

  - ▪ **Bioactivities** – ~300 M biological activity data points

Databases of small molecule

❑ **ZINC database**

- http://zinc.docking.org/

- free public resource for ligand discovery

- 3D coordinates in ready-to-dock formats (i.e. – added hydrogens, partial atomic charges, …)

- molecules in biologically relevant protonated and tautomeric forms

- about 35,000,000 unique molecules grouped by classes

  - 20,000,000 – commercially available molecules

  - 10,000,000 – drug-like molecules

  - 1,000,000 – bioactive molecules

  - …

Preparation of small molecule structure

❑ **AVOGARO**

- https://avogadro.cc/

- free, open source molecule editor and visualizer

- intuitive & easy to use

- useful to convert file formats

- embedded molecular minimization and molecular mechanics

- interface to quantum chemistry packages

Preparation of small molecule structure

❑ **AVOGARO**
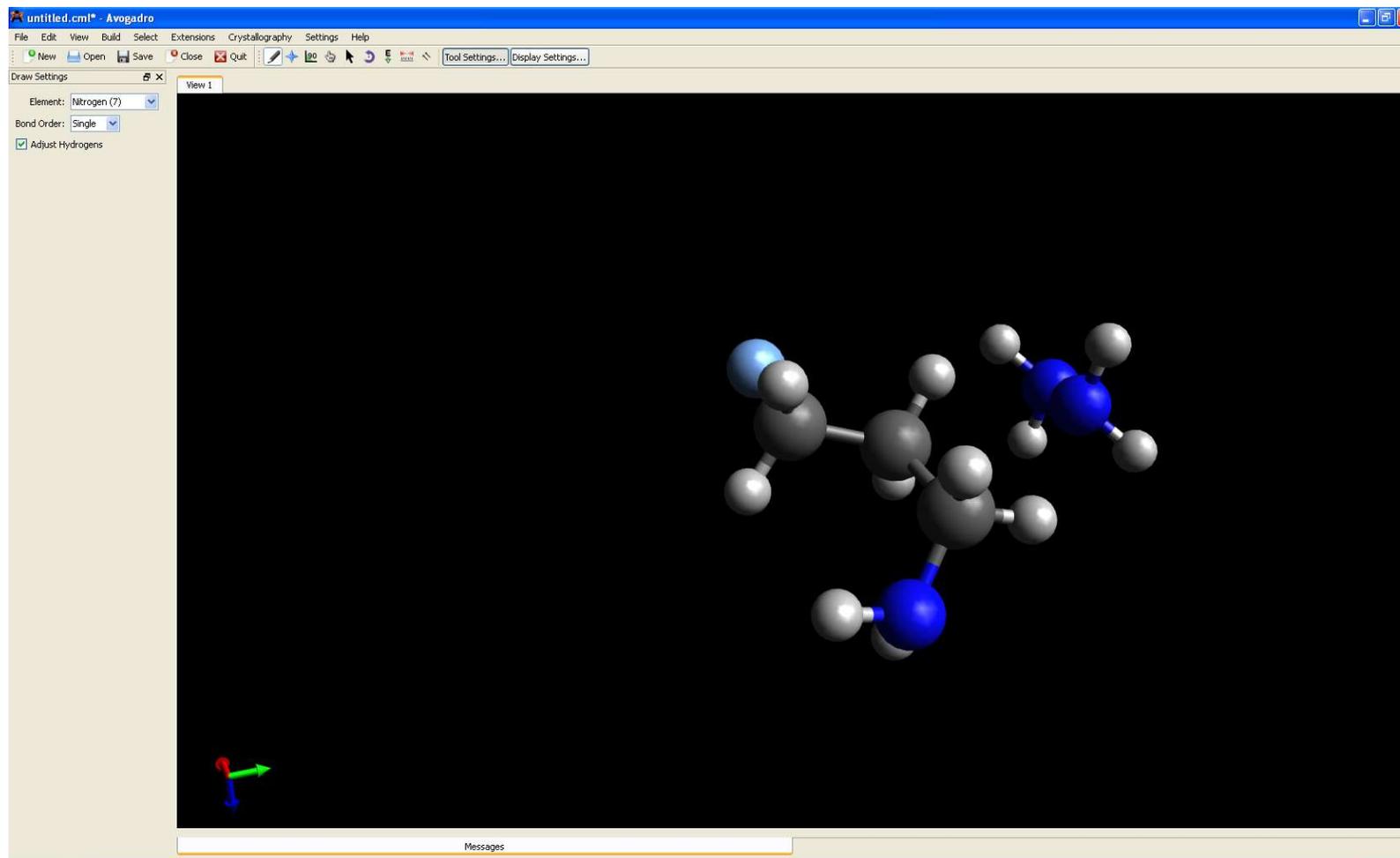
Preparation of small molecule structure

❑ **Open Babel**

- ▪ https://openbabel.org/

- ▪ free, open source

- ▪ widely used molecule format converter

- ▪ command line and graphical interface

Molecular docking

- ☐ Useful when experimental data is not available or

  for screening purposes

- ☐ Several components/steps

    - ☐ Receptor representation

    - ☐ Ligand representation

    - ☐ Searching

    - ☐ Scoring
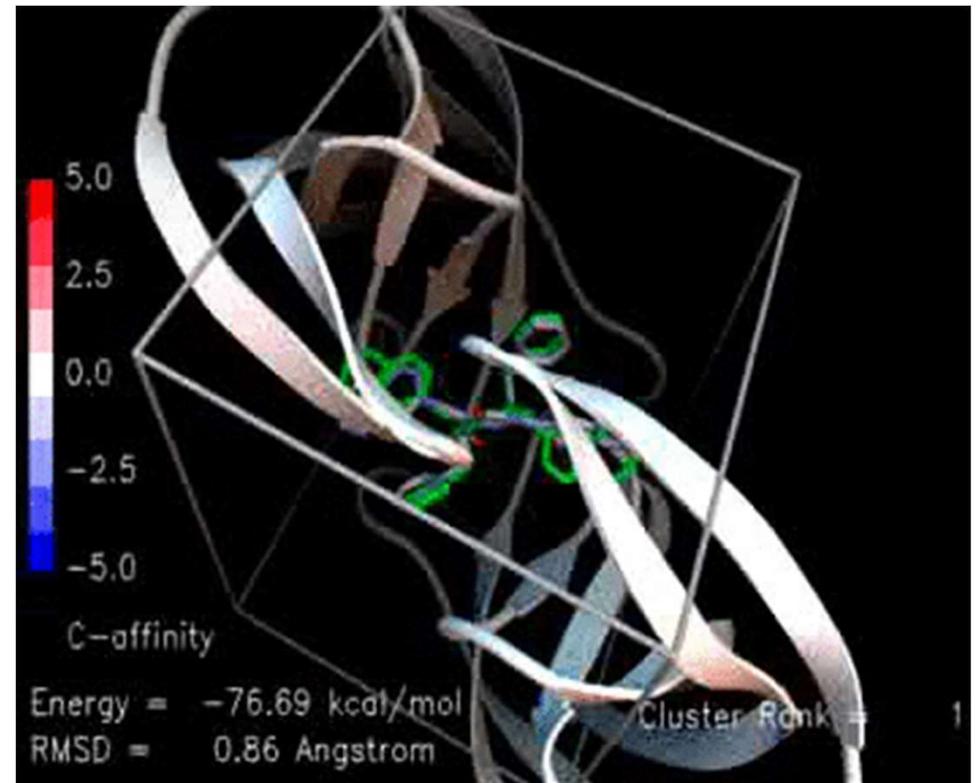
Receptor representation

- **Receptor represented only by relevant binding site**

  - descriptor representation – derived from geometry

    or/and interaction sites of binding site

    (H-bond donor/acceptor, hydrophobic contacts, ...)
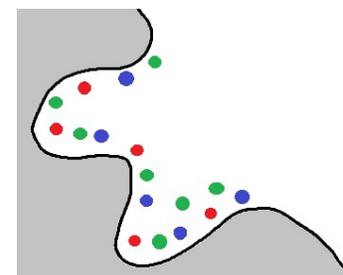
  - grid representation – entire searched region

    is covered by orthogonal equidistant

    points carrying information about

    interaction of probe atom at this point

    with receptor atoms
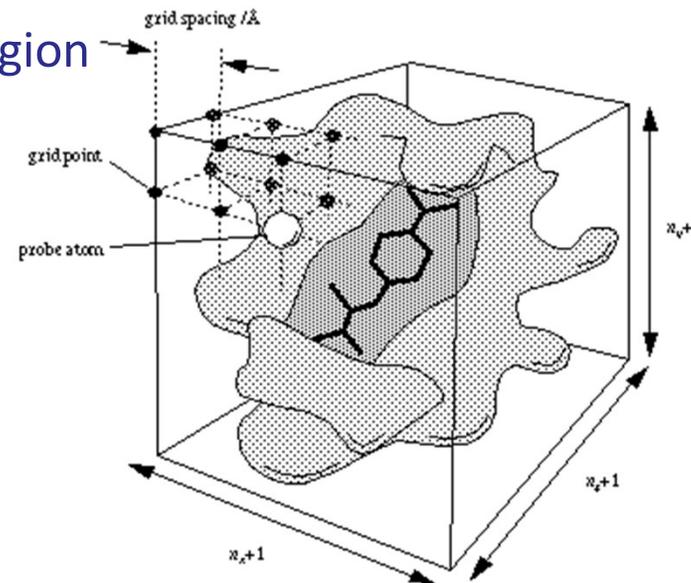
Receptor representation

❑ **Receptor flexibility**

- ▪ **fully rigid approximation**

- ▪ soft docking – employs tolerant "soft" scoring functions to simulate plasticity of otherwise rigid receptor

- ▪ explicit side-chain flexibility – optimization of residues by rotating part of their structure or rotation of whole side-chains using predefined rotamer libraries

- ▪ docking to molecular ensemble of protein structure – obtained from multiple crystal structures, from NMR structure determination or from a trajectory produced by MD simulation
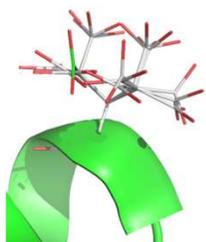
Ligand representation

- **Ligands represented by all atoms or just some**

  - non-polar hydrogens can be united with their respective parent carbon atoms to reduce number of atoms in calculation

- **Ligand flexibility**

  - mostly only rotation about single bonds

  - docking of a library of pre-generated ligand conformations – applicable only to quite rigid ligands due to exponential increase in number of possible conformers with number of rotatable bonds

  - direct sampling of ligand conformation space during searching

  - fragment-based techniques – ligand is cut into several fragments and rigidly docked into binding site

☐ **Many algorithms available**

- Rigid docking 👎

- Semi-flexible 👍

- Flexible docking 👍👍

  (but costly)
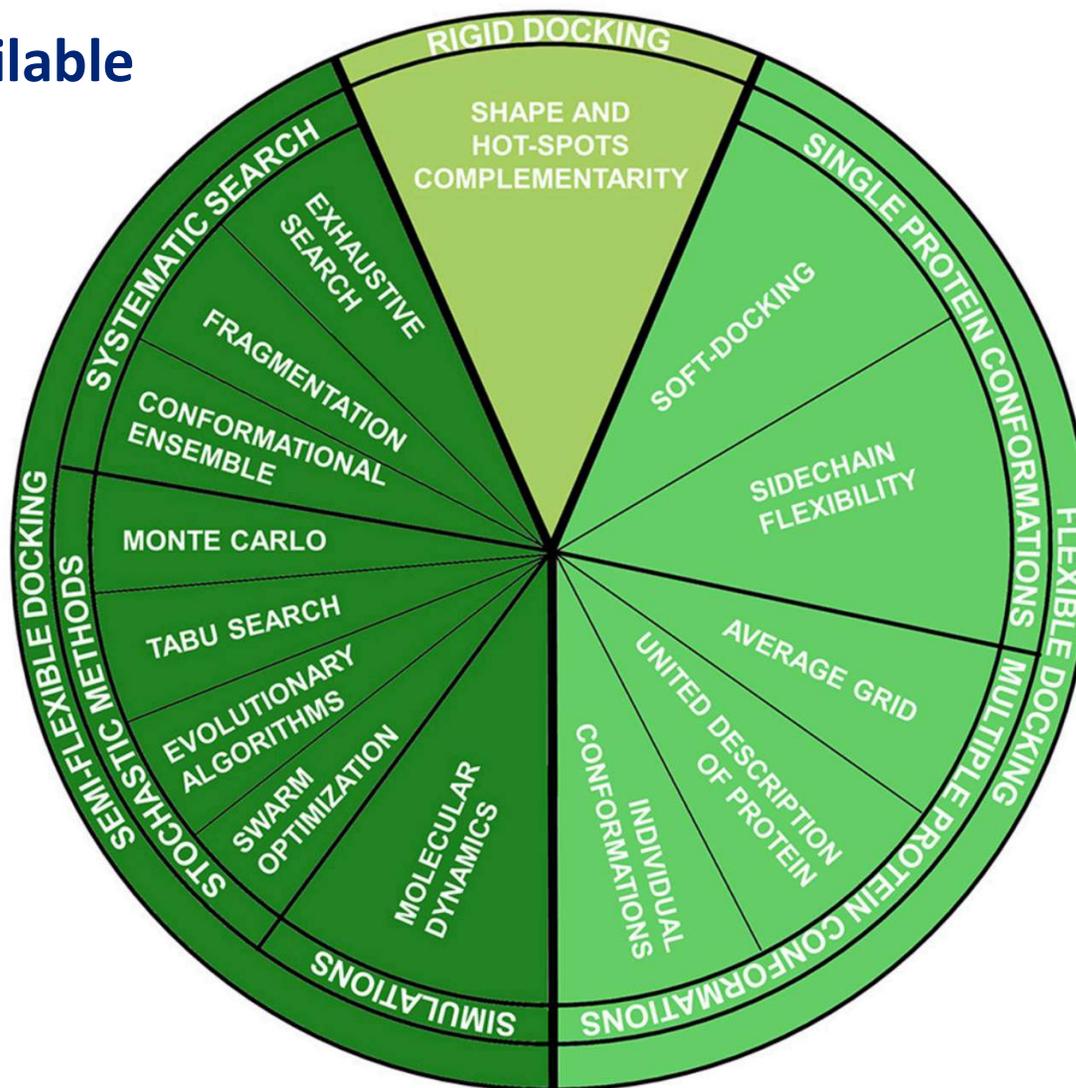
Molecular docking – searching

❑ **Geometry-based and combinatorial algorithms**

- assumes that binding is governed by shape and/or physicochemical complementarity between the ligand and the receptor

- assumes that the degree of complementarity is proportional to the binding energy which is not always true especially for more polar ligands

❑ **Energy-driven and stochastic algorithms**

- tries to locate directly the global minimum of the binding free energy corresponding to the experimental structure

- random basis of these methods requires multiple independent runs of docking calculations to achieve consistent results

Geometry-based algorithms

☐ **Matching algorithms**

- represent a ligand and a receptor binding site by descriptors derived from their geometry and/or presence of particular interaction sites

- try to align/match complementary parts of ligand and binding site and in this way predict the ligand binding mode

☐ **SW packages**

- DOCK – http://dock.compbio.ucsf.edu/

- SLIDE – http://www.kuhnlab.bmb.msu.edu/software/slide/

- …

❑ **Matching algorithms**

Ligand

Ligand descriptors

Interaction sites representation

Receptor descriptors

Matching

Ligand reorientation

Geometric representation

Docked ligand

Geometry-based algorithms

❑ **Fragment-based algorithms**

- ligand is initially fragmented into rigid parts

- two approaches to obtain whole docked molecule

  - incremental construction – fragments are incrementally docked into the receptor until whole ligand is constructed

  - fragment-placing and linking – all fragments are docked simultaneously and then joined together

❑ **SW packages**

- FlexX – http://www.biosolveit.de/FlexX/

- eHITS – http://www.simbiosys.ca/ehits/

- …

Geometry-based algorithms

❑ **Fragment-based algorithms**

Ligand

Ligand fragments

Docked anchor

2nd fragment docked

3rd fragment docked

Docked ligand
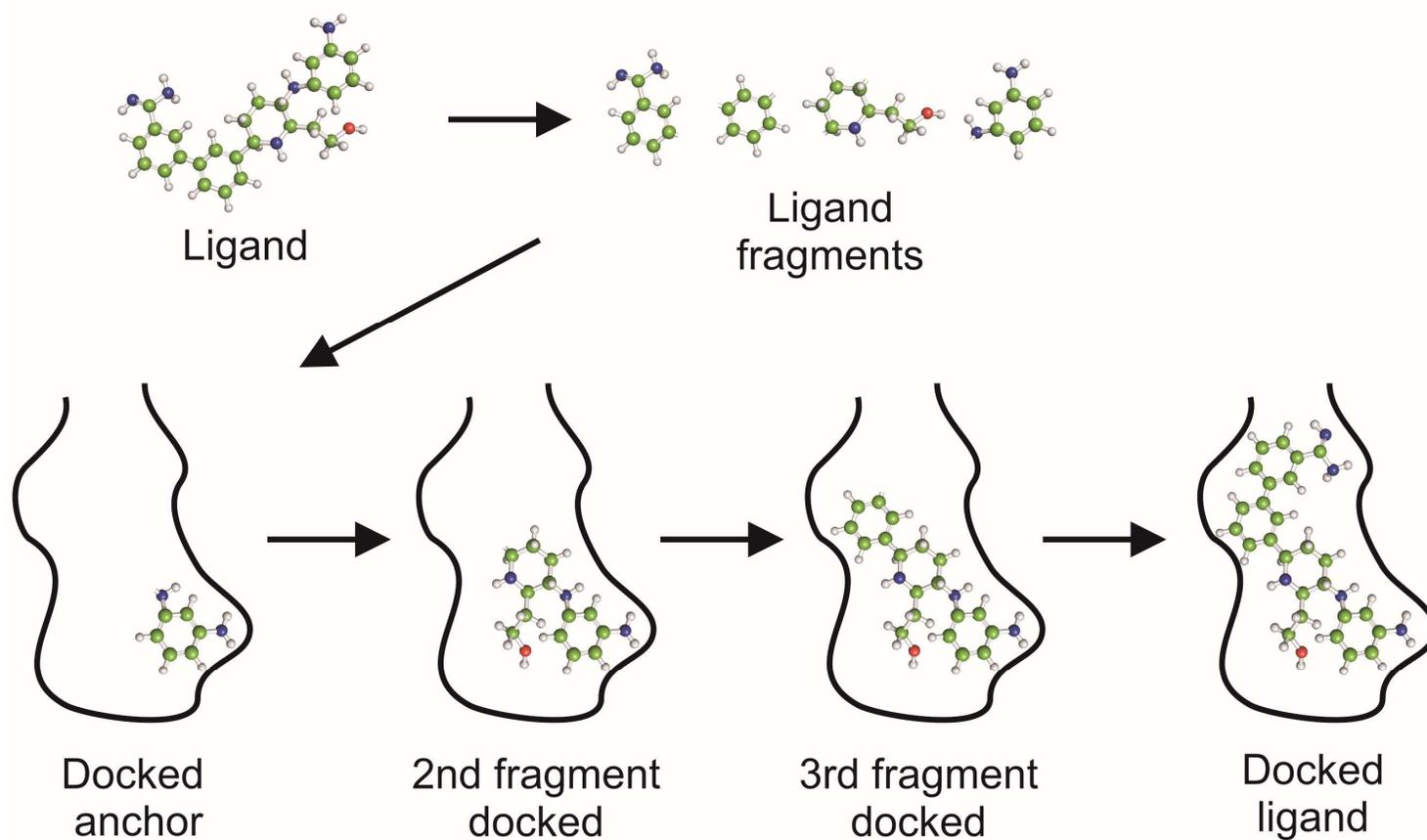
Stochastic energy-driven algorithms

❑ **Monte Carlo algorithms**

- explore protein-ligand interactions space by iteratively introducing random changes into a position, orientation or conformation of the ligand and evaluating new configuration using acceptance criterion

- new configuration is always accepted if its energy is more favorable then the energy of previous configuration or accepted with some probability reflecting energy difference to previous configuration

❑ **SW packages**

- Autodock Vina – http://vina.scripps.edu

- Glide – http://www.schrodinger.com/Glide

- …

Stochastic energy-driven algorithms

❏ **Monte Carlo algorithms**

| E= 0.0 kcal/mol | | E= -0.5 kcal/mol | | E= -1.2 kcal/mol | | E= -0.8 kcal/mol | |

Initial conformation → Bond rotation / Translation / Re-orientation → $E_{NEW} < E_{PREVIOUS} \rightarrow$ **accept** → Bond rotation / Translation / Re-orientation → $E_{NEW} < E_{PREVIOUS} \rightarrow$ **accept** → Bond rotation / Translation / Re-orientation → $E_{NEW} > E_{PREVIOUS} \rightarrow$ **evaluate probability** → Continue for N iterations
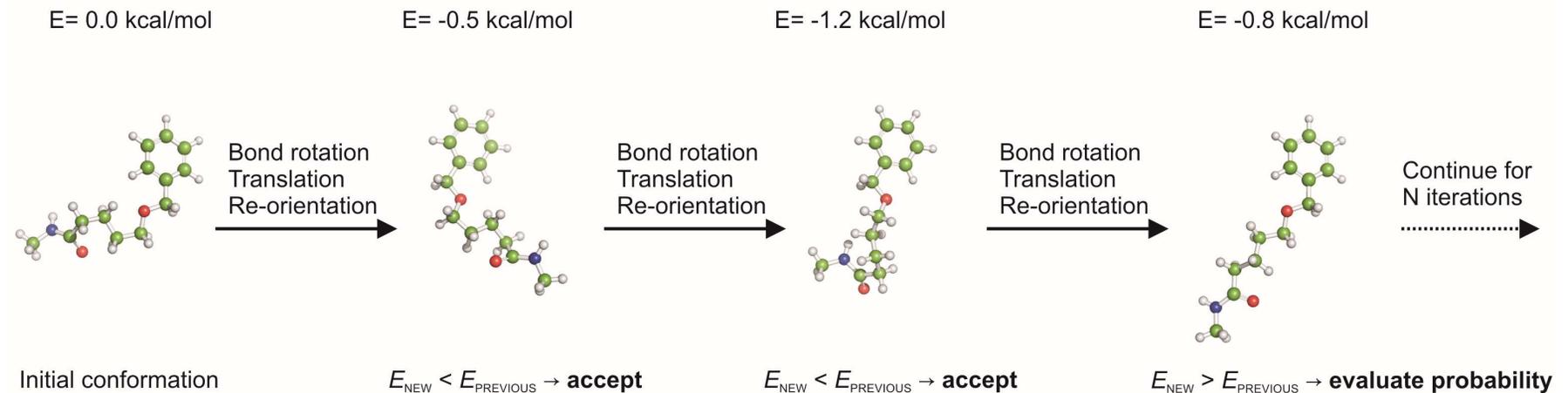
Stochastic energy-driven algorithms

❑ **Genetic algorithms**

- configurations of all ligands from randomly generated initial population are encoded in their genes which are subject of random genetic modification (crossover, single point mutation, …)

- individual with better fitness (corresponds to its binding energy) has higher chance to survive and reproduce to next generation

- overall fitness of population is increasing with each new generation

❑ **SW packages**

- AutoDock – http://autodock.scripps.edu

- GOLD – http://www.ccdc.cam.ac.uk/products/life_sciences/gold/

- …

❑ **Genetic algorithms**

Molecular docking – scoring

❑ **Scoring function**

- evaluate all the binding modes from the searching algorithms

- must be computationally efficient and provide accurate description

   of protein-ligand interactions

❑ **Application of scoring functions to rank**

- several configurations of one ligand bound to one protein –

   essential for prediction of the best binding mode

- different ligands bound to one protein – determination of

   substrate or inhibitor specificity

- one ligand bound to several different proteins – functional

   annotation of proteins and study of drug selectivity

Molecular docking – scoring

□ **Categories of scoring functions**

- ▪ **empirical**

  - ▪ derived by fitting of following equation to experimental binding affinities of known protein-ligand complexes

  $$\Delta G_{bind} = \alpha.\Delta G_{hb} + \beta.\Delta G_{lipo} + \gamma.\Delta G_{el} + \delta.\Delta G_{rot} + ...$$

  - ▪ rapid evaluations

  - ▪ arbitrary selection of terms included in the equation -> failure when binding is governed by some excluded type of interaction

  - ▪ weights are dependent on the chosen training set

Molecular docking – scoring

❑ **Categories of scoring function**

- ■ **knowledge-based**

  - ■ capture the knowledge about protein-ligand binding that is implicitly stored in structural data by statistical analysis

  - ■ atom-pair potentials derived from distances found for such pair in training structural data

    aliphatic carbon-aliphatic carbon

  - ■ rapid evaluations

  - ■ describe all types of interactions without any preselection

  - ■ problem when structural data do not contain sufficient information on particular atom-pairs (e.g. halogens, metals, …)
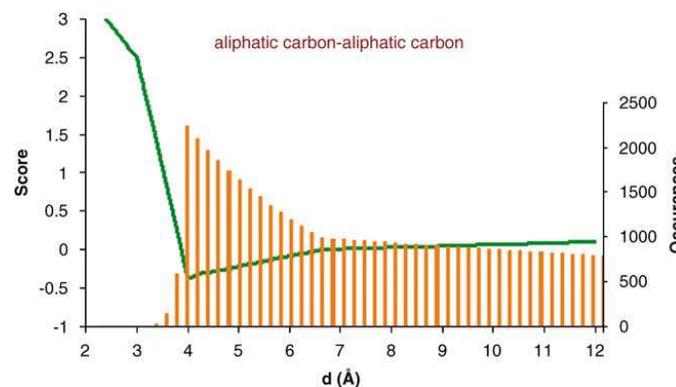
Molecular docking – scoring

❑ **Categories of scoring function**

- ▪ **force field-based**

  - ▪ use the non-bonded terms of well-established force fields

  - ▪ provide precise affinities

  - ▪ high computational demands -> employed for calculating the affinity of some selected binding modes (not during searching)

$$E_{total} = \sum_{bonds} K_r (r - r_0)^2 + \sum_{angles} K_\theta (\theta - \theta_0)^2$$
$$+ \sum_{torsions} \frac{V_n}{2} [1 \pm \cos(n\phi - \gamma)]$$
$$+ \sum_{non-bonded} \left[\frac{A_{ij}}{r_{ij}^{12}} - \frac{C_{ij}}{r_{ij}^{6}} + \frac{q_i q_j}{r_{ij}} \right]$$

Evaluation of complexes

- ❑ Intermolecular interactions

- ❑ Binding energies
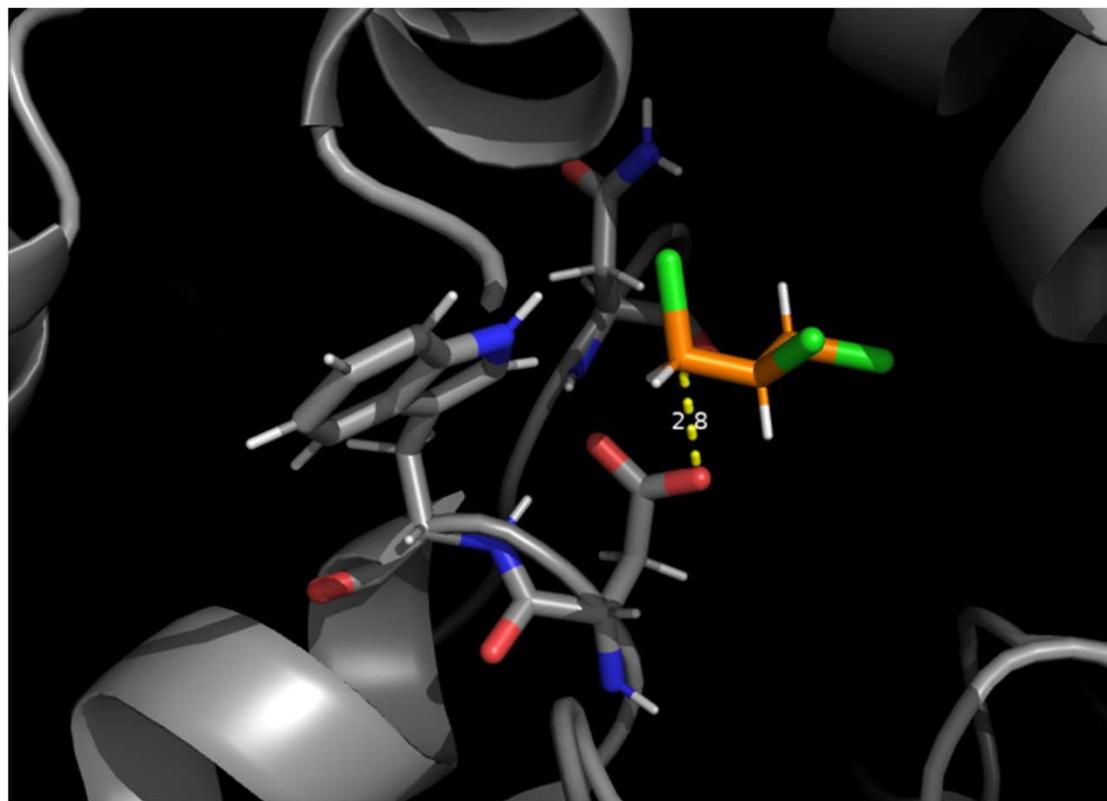
Intermolecular interactions

❑ **Most common types**

- Hydrogen bonds

- Hydrophobic

- Aromatic

- Ionic bonds

Intermolecular interactions

❑ **Visualization**

  ▪ schematic diagrams showing hydrogen bonds and hydrophobic contacts
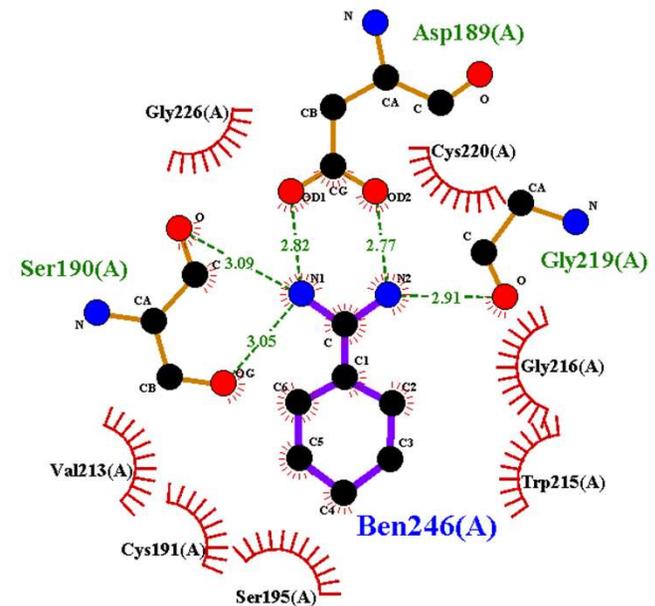
❑ **Tools**

  ▪ LigPlot$^+$

    ▪ stand alone application

    ▪ http://www.ebi.ac.uk/thornton-srv/software/LigPlus/

    ▪ pre-calculated for protein-ligand complexes in PDBsum

Binding energies

❑ **Binding Affinity Prediction of Protein-Ligand server**

- http://www.scfbio-iitd.res.in/software/drugdesign/bappl.jsp

- calculates binding free energy

  of a protein-ligand complex

  using all-atom-energy-based

  empirical scoring function

Transport of small molecules

❑ **CaverDock**

- https://loschmidt.chemi.muni.cz/caverdock/

- Analysis of tunnels by Caver

- Discretization of identified tunnel into discs

- Molecular docking by AutoDock Vina to every disc

❑ **Caver Web**

- https://loschmidt.chemi.muni.cz/caverweb/

- Web interface for Caver and CaverDock

Transport of small molecules

CAVER

Active site

Discretization

CaverDock

Transport of small molecules

Transport of small molecules

❑ **CaverDock**

Tunnel bottleneck

+

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