This semester

Models – mostly proteins

• from detailed to more abstract models

Some simulation methods

Books

None necessary – for my group and Prof Rarey

- "Molecular Modelling: Principles and Applications" Leach, Andrew (good, not cheap)
- Essentials of Computational Chemistry : Theories and Models / Christopher J. Cramer (ebook, in library) bits of chap 2 & 3

- Folien sind immer in Stine
- What you should not do...

Grand Plan

- Models for proteins (mostly)
 - from detailed to less details
- Energies
- Dynamics
- How to work with them
- simulations, calculations
 - protein folding, evolution
- What kind of model is appropriate for different problems ?

Themes

- atomistiche Energie-Modelle
- Energie / Freie Energie
- Monte Carlo (MC)
- Molecular Dynamics Simulations (MD)
- Applications and Extensions of MC and MD
- Advanced Monte Carlo
- Water
- Coarse Grain / Mesoscopic / low resolution methods
- Lattice Methods
- Evolution
- Protein Folding

Organization

Im Prinzip

- 2 × Vorlesung
- 1 × Vorlesung
- 1 × Übung

In der Praxis

- 2 × Vorlesung + 2 × Vorlesung or
- 2 × Vorlesung + 2 × Übung

People

• Nils Petersen

Zeitplan

- Mo 10:15
- Di 12:15

Organization

Klausurtermine in Stine (17 Juli, 25 Sep)

Andrew der Pedant - bei Klausuren

- Energie/potenzielle Energie/freie Energie
- absolute Werte / relative Werte
- größere / kleinere, mehr positiv / mehr negative
- Vektoren, Skalar
- Vorzeichnungen...

Some questions

- 3 bonded atoms push atom k left
- which atoms will feel a force ?

I have a multiple sequence alignment

- the conserved sites are most important
- is this true ?

Can you compare the free energy of two conformations of

- a drug ?
- a protein ?

To be answered during the semester..



Do I have to memorise all the formula ?

Very few

- Coulombs law
- example form of energy for bonds and angles
- Boltzmann distribution
- definition of entropy
- relationship of free and potential energy

Most other examples will be derived

Why are we here ?

- observables
- distributions
- two ways to get at distributions
 - 1. from Boltzmann relation (later)
 - 2. from dynamics simulations
- dynamics simulations
 - need forces
- forces need energies

Observables

- *A* is density, coordinates, something you can measure
- what you see is $\langle \mathcal{A} \rangle$ the average over time and molecules $\langle \mathcal{A} \rangle = \frac{1}{\tau} \int_0^{\tau} \mathcal{A}_t dt$
- simulating gives us a sampling over time / molecules



- 3 rotamers in a protein
- they are not equally likely



How to get the correct averages ?

- simulate the system and do the averaging over every ${\mathcal A}$ in the simulation
- how would you simulate ?



Simulations need forces and energies

Distributions depend on energies

• we need energies

Dynamics simulations need forces

• forces come from energies $F = \frac{-dU}{dr}$

So we spend weeks discussing energies



Atomistic Energy Models

Why do we need models?

- Previous lectures need for low energy configurations
 - really needs definition of energy

Can we define energy ?

- for very simple systems yes
- for more complex systems
 - only approximations

Need to know when approximations are small and when bad

- are charges on atoms like fixed charges ?
- are bonds like springs ?

Is energy sufficient?

Does the world care about potential energy?

• No. Really cares about free energy

G = U - TS (usually speak of ΔG)

Approach to free energy

- calculate potential energy "*U*" with a model
- get entropy "*S*" from some sampling method (often implicit)

Need good models for energy

Definitions

This topic is classical / atomistic

- often referred to as "molecular mechanics"
- quantum effects are not reproduced

Different levels of models

QM	ab initio	very detailed	1
	semi-empirical		
atomistic			
coarse grain continuous			
lattice			
big molecule as single point	S	very coarse (colloids, diffusion)	V

Why we like atomistic models

Intuitive

• how do we draw structures ? store coordinates ?

Atoms sometimes correspond to measurable properties

- x-ray crystallography, NMR
- predicting some dynamics
- interactions between proteins, proteins + ligands

What is a force field ?

Set of equations / formulae that tell us about the force acting on a particle

Classic example

- I have charge
- bring another charge near, it feels a force due to the first
- what is the equation telling me about the energy ?



$$U(r_{ij}) = \left(\frac{1}{4\pi\epsilon_0}\right) \frac{q_i q_j}{r_{ij}}$$

and the force...

Force fields, energies, derivatives

Important rule $\vec{F} = \frac{-dU}{d\vec{r}}$

A toy example, one dimension $U(\vec{r}) = k\vec{r}$

- force is $\vec{F} = \frac{-dU}{d\vec{r}} = -k$
- How do we want force ?
- in *x*, *y*, *z* terms \vec{r}

$$F_{x} = \frac{-\partial U}{\partial x}$$

really
$$F_{y} = \frac{-\partial U}{\partial y}$$
$$F_{z} = \frac{-\partial U}{\partial z}$$





A simple force

With an energy
$$U(r_{ij}) = \frac{1}{4\pi\epsilon_0} \frac{q_i q_j}{r_{ij}}$$

force is
$$\vec{F} = \frac{-dU}{d\vec{r}} = \frac{1}{4\pi\epsilon_0} \frac{q_i q_j}{r_{ij}^2} \hat{r}_{ij}$$

Rule

- if the derivative of an energy is non-zero
 - there is a force (remember for exams)



Protein force fields as equation

 $U(\{\vec{r}\}) =$

 $\sum_{i=1}^{N_{bond}} \frac{k_i}{2} (r_i - r_{i,0})^2$ bonds $+\sum_{i=1}^{N_{angles}}\frac{k_i}{2}(\cos\theta_i-\cos\theta_{i,0})^2$ angles $+\sum_{i=1}^{N_{dihedral}}k_i(1+\cos(n\varphi_i-\nu_{i,0}))$ dihedrals $+\sum_{i=1}^{N_{atom}}\sum_{i=1}^{N_{atom}} \left(4\epsilon_{ij}\left(\left(\frac{\sigma_{ij}}{r_{ij}}\right)^{12} - \left(\frac{\sigma_{ij}}{r_{ij}}\right)^{6}\right) + \frac{q_iq_j}{4\pi\epsilon_0 r_{ij}}\right) \quad \text{non-bonded}$

Not a bad approximation x_i is a value in the coordinates, $x_{i,0}$ is a literature reference value

Bonds

What are bonds really ?

• as we pull two particles apart, what happens ?



r_{ij}

• can we approximate ?

Bonds - approximate



Bonds – good enough

Bonds do not stretch much

• harmonic is often good enough



Bonds – the end

We normally write
$$U(r_{ij}) = \frac{k}{2}(r_{ij} - r_0)^2$$

as scalar..
$$F = \frac{-dU}{dr} = -k(r - r_0)$$
 which looks like Hookes law

Do bonds matter ?

- fluctuations very small at room temp (< 0.1 Å)
- our structures are not so accurate / we simulate to look at coarse features
- often treated as rigid joints (maybe more in MD lectures)

Angles

Angles are not as boring as bonds

$$U_{angle(\vec{r}_i,\vec{r}_j,\vec{r}_k)} = \frac{k}{2} \left(\cos\theta_{ijk} - \cos\theta_0\right)^2$$

or



$$U_{angle\left(\vec{r}_{i},\vec{r}_{j},\vec{r}_{k}\right)} = \frac{k}{2} \left(\theta_{ijk} - \theta_{0}\right)^{2}$$

but to get forces is messy (use chain rule) ... why?

Why are forces difficult?

We use physical models like

$$U_{angle}(\vec{r}_i, \vec{r}_j, \vec{r}_k) = \frac{k}{2} (\cos \theta_{ijk} - \cos \theta_0)^2$$



Force is obvious

- looking at picture
- in terms of $\cos \theta$
- in terms of θ ?
- we want *x*, *y*, *z*

$$\vec{F}_{angle}(\vec{r}_i) = \frac{-\partial U(\vec{r}_i)}{\partial(\vec{r}_i)}$$

$$=\frac{-\partial U(\vec{r}_i)}{\partial\cos\theta}\frac{\partial\cos\theta}{\partial(\vec{r}_i)}$$

$$=\frac{-\partial U(\vec{r_i})}{\partial\cos\theta}\frac{\partial\cos\theta}{\partial\theta}\frac{\partial\theta}{\partial(\vec{r_i})}$$

Angle forces

$$= \frac{-\partial U_{angle}(\vec{r}_i)}{\partial \vec{r}_i}$$

$$F_{angle_i} = \frac{-\partial U_{angle}(\vec{r}_i)}{\partial \cos \theta_{ijk}} \frac{\partial \cos \theta_{ijk}}{\partial \vec{r}_i}$$

$$= k (\cos \theta_{ijk} - \cos \theta_0) \left(\frac{\vec{r}_{kj}}{r_{jk}} - \frac{\vec{r}_{ij}}{r_{ij}} \cos \theta_{ijk}\right) \frac{1}{r_{ij}}$$

The other atoms ?

similar expression for F_k $F_j = -(F_i + F_k)$



dihedral / torsion angles

basically...



but details will vary



- how large are energy barriers?
- how many minima are there ?

Form of dihedral term







What are the causes ?

- do *i* and *l* interact ?
- electron clouds from *j* and *k*?
- model $k_i(1 + \cos(n\varphi_i \nu_0))$



model for dihedral angles

$$U(\vec{r}) = k_i (1 + \cos(n\varphi_i - \nu_0))$$

n controls multiplicity

- *n* = 3 butane
- n = 2 peptide bond

At room temperature, barriers are similar to *kT* so

- atoms do rotate, but there are preferences (from spectroscopy)
 How good is the model ? Not perfect
- some rotamers are preferred (need other terms)

What do forces look like ? scary (much trigonometry)

• intuitively easy, maths messy- think of *j* and *k*



Non bonded forces

- van der Waals / Lennard-Jones / dispersion + attraction
- electrostatic

Why are they separated from others?

- bonds, angles and dihedrals
 - you know the participants in advance
- non-bonded
 - atoms can move to and from each other

van der Waals

What do we know in advance ?

- "inert" gases do form liquids (atoms like each other)
- atoms do not sit on top of each other



• distance of minimum energy = $2^{1/6} \sigma$

van der Waals – how good is it ?

Repulsive and attractive look similar

• quite different

$$U(r_{ij}) = 4\epsilon_{ij} \left(\left(\frac{\sigma_{ij}}{r_{ij}} \right)^{12} - \left(\frac{\sigma_{ij}}{r_{ij}} \right)^6 \right)$$

Attractive part?

- electrons wobble and talk to neighbours induce charges
 - r^{-6} pretty good

Repulsive part?

- what do atoms look like ?
- really exponential, r^{-12} is just convenient

Lennard-Jones terms – how real ?

How real is it?

- good for liquid argon
 - diffusion, transport...
- Lennard-Jones fluids

Nice features

- ε , σ = "well depth" and size
- ε , σ specific for atom pairs
 - σ for H is tiny, for C is much bigger

Electrostatics

Coulombs law

Sounds easy
$$U(r_{ij}) = \frac{q_i q_j}{4\pi\epsilon_0 r_{ij}}$$
 or $U(r_{ij}) = \frac{q_i q_j}{D r_{ij}}$

D is dielectric constant

Why is it difficult?

- what is *D* ?
- with and without water ?
- intervening protein?





• more on solvent models later

Model can be made better / worse

Is this model good or bad ? fast or slow ? What will it be used for ?

- molecular dynamics simulations, energy minimising
 - rarely a simple energy evaluation
- CPU intensive

Conflicting goals

- make model cheaper, but maintain quality
- add details to make model better
Cost of model

Cost of model ?

- bonds, angles, dihedrals *O*(*n*)
- non-bonded *n* particles interact with n particles $O(n^2)$
- probably $\approx 90\%$ of time spent on non-bonded interactions

Many simplifications

• some are popular and important

Cheaper models - United atoms / heavy atoms

When does a proton matter ?

- charge interactions, H bonds When is a proton not interesting ?
- most aliphatic and aromatic
- hardly a charge / tiny radius
 Do we even need the hydrogen ?
- Use a "united atom"
 - mass easy 12 + 1
 - charge ? nothing
 - radius slightly larger

Rule

- use explicit H in polar groups
- absorb everywhere else
- CH, CH₂, CH₃



United atoms how bad?

Gain of united atoms ?

- roughly halves number of atoms
- Costs ?
 - dynamics ? no problem
 - structure ? not too bad

Problems?

- some small effects can be seen in certain systems
 - lipids
- maybe some effects in proteins



Cutoffs (cheaper models)

How important is an interaction ?

- some are not interesting (bonds)
- some depend where you are

$$U(r_{ij}) = 4\epsilon_{ij} \left(\left(\frac{\sigma_{ij}}{r_{ij}} \right)^{12} - \left(\frac{\sigma_{ij}}{r_{ij}} \right)^6 \right)$$

- r^{-6} and r^{-12} become small quickly
- if $r_{ij} > 6$ to 8 Å, $U_{LJ}(r_{ij}) = 0$ • not a problem



more difficult.. for other terms

cutoffs - problems

Electrostatics

- r^{-1} shrinks slowly
- but eventually, we should be able to ignore
- bigger cutoff (10 15 Å)

In practice

- use one cutoff for all non-bonded calculations
 Problems
 - subtle look at derivative



Possible improvements

Better bonds ?

- more sophisticated than harmonic $(r r_0)^2$
- can do not very interesting
- L-Jones better than r^{-12} ?
- can do not worth worrying about Electrostatics
- polarisation ?
 - completely lacking from model so far (fixed partial charges)
 - we know it is important
 - popular, difficult

Water

• model so far is *in vacuo* ... more later

Problems and fixes in model

Model is fundamentally wrong

- think about forms of functions
- all two-body based, compare...



Can we represent interactions with two body form ?

- can be good for a small range
- remember earlier picture...
- what works well at 300K may not work at 600K





Why problems may not be seen

Model is not perfect, why do simulations work?

• lots of parameters, not independent

Simple example

- what controls density of a polar fluid
 - charges ?
 - Lennard-Jones terms? Both

Complicated example

- rate of rotation..
 - torsional term (k in torsion term)
 - size of atoms and barriers (ϵ , σ) (less important)
 - angles ? (less important)

Errors in one part of force field compensated elsewhere



Testing force fields

What should a force field do?

- structure
 - simulate a protein
 - it should not blow up (necessary / not sufficient)
 - density
 - anything you can calculate and measure (distances, chemical shifts..)
- reproduce energy changes (free energies)
- global minimum (free) energy should agree with experiment
- dynamics properties
 - which torsion angles rotate at room temperature ?
 - order parameters from NMR

Transferability

Perfect model of physics would work in all cases

- atomic parameters same from protein to protein
- from protein to organic molecule
- across temperature ranges ?

Disappointments / difficulties

Special systems / special problems

- highly charged systems
 - DNA
 - solvent and charges
- lipids
 - repetitive nature emphasises some problems

Meaning of disappointment

- simulate a protein and it falls apart
- it implodes
- density of a system is wrong
- energetic predictions are wrong
- dynamic predictions are wrong
- smaller structural predictions are wrong

Parameters

- Force field / model has lots of parameters
- charge, mass, ε, σ,
- bond lengths, angles, ... for each type of bond / angle /dihedral
- Sources
 - literature
 - mass
 - partial charges ?
 - high level calculations
 - measurements on small molecules (crystallography)
 - bond lengths, geometry
 - trial and error (example)
 - simulate a liquid
 - \bullet reduce σ to increase density
 - \bullet decrease ϵ to make it boil more easily

Parameters are a compromise

Model is not perfect

- internal compensation
- compromise example
 - partial charges are not really fixed
 - depend on environment + geometry
- make a decision and adjust others to work in important area

Atomistic force field summary

Model for potential energy

• proteins, organic molecules ..

Main model

- ignore water
- 3 kinds of bonded interactions
- 2 non-bonded
- Conservative force field
 - $U(r_{ij})$ energy depends on coordinates only
 - no time component
- Energy continuous
 - useful
 - derivative always defined
 - very useful

more summary

- main model
- speed-ups cutoffs, united atoms
- where do parameters come from ?
- what should parameters do?
- why may you not see errors in parameters ?

Where next?

- Better models (not much)
- Fixing worst aspects
- Simpler models
- Simulation
- first some rules from statistical mechanics

Simulations / statistical mechanics / ...

Topics

- very simple stat mechanics
- Monte Carlo
- molecular dynamics

Favourite books

- "Understanding Molecular Simulation", Frenkel and Smit, Academic Press, 2002
- "Computer Simulation of Liquids", Allen & Tildesley, Oxford Science Publications, 1990

Concepts

- potential energy
- work
- entropy
- free energy

Goal

- There are models for potential energy
- for free energies we need simulations

Nomenclature

- *T* temperature
- *N* all kinds of things, usually number of particles
- k and k_B Boltzmann's constant
- R gas constant = $k N_a$
- *S* entropy
- *F* Helmholtz (NVT)
- *G* (Gibbs) free energy (NPT)
- *U* internal energy

- H enthalpy = U + pV
- E energy, E_{kin} , E_{pot} , E_{bond} , ...
- Q heat
- W work
- V volume
- Ω (x) number of states of system with property (x)
- \vec{r} or \vec{r} or **r** vectors
- $\{r\}$ collection of vectors

Potential energy

electrostatic
$$U(r) = \frac{q_1 q_2}{4\pi\epsilon_0 r}$$

gravity
$$U(r) = \frac{Gm_1m_2}{r}$$

elastic, ...

potential energy of a protein...

- where would the protein like to be ?
- will be more interesting in ten minutes



Conserving energy

For this course:

- first law
- relevant energies
- is it obvious ?
- when do we not conserve energy ?

First law

- $dU = \Delta Q + \Delta W$
- *dU* change in internal energy
- ΔQ heat given to system
- ΔW work done on system
- example of work...

Work on a gas

 $\Delta W = -P\Delta V$

 $dU = \Delta Q + \Delta W$ $= \Delta Q - P \Delta V$



state a

state b

Others

- charges in electric fields, surface tension / area,
- we do not often do this in this course
- in one lecture: W will be important
 ... how hard is it to move a ligand from solvent into a protein ?

Conserving energy

Newtonian dynamics coming soon

• what is the energy of a particle ?

$$E_{tot} = E_{pot} + E_{kin}$$

energy of a system ? (box of gas, protein in water)
 N_{particles}

$$E_{tot} = \sum_{i=1}^{r} \left(E_{pot_i} + E_{kin_i} \right)$$

• total energy is conserved – potential + kinetic

Do we always have kinetic energy?

- Monte Carlo no
- Wirkstoffentwurf-Vorlesungen no

Conserving energy – always obvious ?

- in the real world ? closed systems ? yes
- almost everything in this course yes

Simulations

- if I want to use statistical mechanics, standard theory
 - no heating
 - no changing the force field (sounds obvious ?)
 - I want to simulate protein (un)folding
 - pull on the C-terminus illegal does work on system
 - heat system illegal
 - push a drug (Medikament) into binding pocket illegal

There is more than kinetic and potential energy.



Simulation and formal statistical mechanics



Quantified ?

• entropy and free energy

Dumb simulation, preferring to go downhill

• should show how probabilities (entropy) are balanced against energy

History

Statistical mechanics

• derived by summing up properties of individual particles

Thermodynamics

• less emphasis on individual particles

Lots of formulae which cannot be completely applied to proteins

• sums over infinite volumes, numbers of particles, time

Rules and Limitations

Always at equilibrium

Entropy

- you tend to become disordered (2nd law)
- role in free energy
- formula for simple systems

Disorder, how many ways can the system arrange itself.

- depends on energy (and volume and number of particles)
- two formulae coming... simple, more useful

How many states can the system have (specified *E*)? $\Omega(E)$

Entropy

 $S = k \ln \Omega(E)$

(very simple form)

Number of states $\Omega(X)$







A bit more energy ? more states

• more.. solid \rightarrow liquid .. many many more

Gibbs

What if states are not equally likely?

 N_{state} states with distribution

• Let $p_1 = 0.999$, $p_2 = 0.00001$, $p_3 = 0.00001$,

just as if the system had one state - low entropy

• Let
$$p_1 = 0.5$$
, $p_2 = 0.1$, $p_3 = 0.1$,

a bit more entropy, but still very much dominated by p_1

• Let
$$p_1 = 0.01$$
, $p_2 = 0.01$, $p_3 = 0.01$,

- lots of states, all equally likely
 - lots of entropy

In general

$$S = -k \sum_{i=1}^{N_{state}} p_i \ln p_i$$

Gibbs entropy !!

Applicability

Can one really estimate ? $S = -k \sum_{i=1}^{N_{state}} p_i \ln p_i$

- liquid.. no
- protein .. no
- With a simulation ?
- too many states
- approximations to ΔS later
- Simple system (grid / lattice)
- yes .. later in semester

Units

More arrangements = more entropy

Connected to energy

• balance of energy and entropy

Entropy units

• energy / temp (JK⁻¹)



Where can we use this ?

What is the entropy of a molecule ?

- sounds easy
- really...

Entropy depends on solvent (system)

Entropy of a conformation ?

• has no meaning

$$S = -k \sum_{i=1}^{N_{state}} p_i \ln p_i$$

Is it additive ? Only rarely – not for interesting systems





Adding entropy



Entropy is "extensive"

$$S_{AB} = -k \ln(\Omega_A \Omega_B) = -(k \ln(\Omega_A) + k \ln(\Omega_B)) = S_A + S_B$$

Assumption

• for my new system A and B do not interact

What if they interact?

• putting A in state 1 changes probability of B in state 1

 $S = -k \sum_{i=1}^{N_{state}} p_i \ln p_i$

$$\Omega_{AB} \neq \quad \Omega_A \, \Omega_B$$

Adding entropy

I cannot usually add the entropy of two systems to get the entropy of new total system

Two systems

- could be boxes (previous slide)
- could be parts of a molecule (coming)

Do not add entropy terms ! Exam questions (promise)

Can I decompose entropy?

May we decompose entropy ?

Remember energy in proteins

 $E_{tot} = E_{bonds} + E_{vdw} + E_{...}$ $S_{tot} = S_{bonds} + S_{vdw} + ...?$ Ð

No.

• Makes no sense unless bonds are decoupled from atoms and angles...

$$S_{ligand} + S_{solvent} + \dots$$

• obviously do interact

Free energies

$$G_{solv}$$
, $G_{protein}$, G_{ligand} , G_{bonds} not really legal

• imagine bonds are system A, angles are system B, ..
Decomposing Free Energy

Would you see this in the literature ?

Example

- in protein asp \rightarrow as mutation (COO⁻ to CON)
- protein becomes more stable

Claim:

• the protein is more stable due to a change in electrostatic free energy

What has been implicitly assumed ? There is no such thing as ΔG_{el}

More examples - particle interactions

You have a scoring function for interactions

• usually called ΔG

$$\Delta G_{tot} = \Delta G_{HB} +$$
H-bonds
$$\Delta G_{ionic} + \dots$$
ionic

• is this legal ?

Entropy of a conformation ?



Meaning of labelled free energies

If we have "free energy contributions"

• we have entropy contributions

 $\Delta G_{HB} \text{ implies } H_{HB} + T\Delta S_{HB}$ $\Delta G_{ionic} \text{ implies } H_{ionic} + T\Delta S_{ionic}$ what is S_{ionic} ? $S = -k \ln \Omega_{ionic}$? • no meaning

One cannot have "free energy contributions"

independence of terms

Even without labelled entropies



Can we add free energy due to Hbond 1 and 2?

- implies $\Delta S = \Delta S_1 + \Delta S_2$
- $-k \ln \Omega = -(k \ln \Omega_1 + k \ln \Omega_2)$
- $-k \ln \Omega = -k \ln(\Omega_1 \Omega_2)$

- only possible if there is no interaction between 1 and 2
- additivity of free energies is widely used (usually wrong)

Stop and summarise

- Internal energy *U* things like springs
- Enthalpy *H* includes pressure
- Gibbs free energy *G* what we usually use
 - no discussion of different ensembles in this course
- Free energy lets us incorporate the concept of what is most likely
- Entropy is not additive between systems (parts of systems) that interact

Boltzmann distribution – two states

System with two energy levels

- I know the temperature and energy difference
- How likely is system to sit in $E_1 ? E_2 ?$
 - System is very cold,
 - ΔE seems big
 - System is very very hot $T \rightarrow \infty$
 - ΔE does not matter, seems small
- Relative populations (probabilities) p_1, p_2
- $\Delta E = E_2 E_1$

$$\frac{p_1}{p_2} = e^{-\Delta E}/_{kT}$$

• sometimes $\frac{p_1}{p_2} = e^{-\beta \Delta E}$



Sign conventions

$$\Delta E = E_1 - E_2 \quad \text{or } \Delta E = E_2 - E_1 \qquad ?$$

For exams

- the lower energy state is always more populated
- there are always questions about probabilities / energies
- state with most negative energy is most populated

Boltzmann distribution

What is the probability of a certain energy level?

• depends on all available levels

$$p_i = \frac{e^{-\beta E_i}}{\sum_j e^{-\beta E_j}}$$

• name of bottom ... partition function,

$$Z = \sum_{i} e^{-E_{i}/_{kT}}$$

• does this agree with previous slide ?

Going from two to *n* states



but this is for the ratio of two states. If we have *n* states, we are interested in $\frac{p_1}{p_1 + p_2 + p_3}$

 $p_1 + p_2 + p_3$

Let us turn this upside down and start with $\frac{p}{2}$

$$\frac{p_1 + p_2 + p_3 + \cdots}{p_1}$$

let us consider some more states and get the absolute fraction for p_1

$$= \frac{p_1}{p_1} + \frac{p_2}{p_1} + \frac{p_3}{p_1} + \cdots$$
$$= \frac{e^{-\beta E_1}}{e^{-\beta E_1}} + \frac{e^{-\beta E_2}}{e^{-\beta E_1}} + \frac{e^{-\beta E_3}}{e^{-\beta E_1}} + \cdots$$
$$= \frac{e^{-\beta E_1} + e^{-\beta E_2} + e^{-\beta E_3} + \cdots}{e^{-\beta E_1}}$$
$$= \frac{\sum_j e^{-\beta E_j}}{e^{-\beta E_1}}$$

03.05.2018 [83]

turn upside-down,

$$p_i = \frac{e^{-\beta E_i}}{\sum_j e^{-\beta E_j}}$$

where the summation runs over all states of the system

Consequences of Boltzmann distribution

At absolute zero

- only lowest energy state is populated At low temperatures
- low energy states favoured

High temperature

- system can visit high energy regions
 Infinite temperature
- all states equally likely

For two states (bound / unbound)

exponential term means populations quickly become big/small

$$\frac{p_1}{p_2} = e^{-\Delta E/_{kT}}$$

How big are energy differences ?

Simplest case, equal populations
$$\frac{p_1}{p_2} = e^{\frac{\Delta E}{kT}}$$

 $p_1 = p_2$

$$1 = e^{\Delta E}/_{kT}$$
$$\ln 1 = \frac{\Delta E}{kT}$$
$$\Delta E = 0$$

 $k = 1.38 \times 10^{-23} \text{ J K}^{-1}$, but use

$$R = k N_A$$

= k 6.02 × 10²³ J K⁻¹mol⁻¹
= 8.314 J K⁻¹ mol⁻¹



Drugs

- Dissociation constant k_d of drug D to protein P $k_d = \frac{[D][P]}{[DP]}$
- nanomolar drugs are 10^{-9} ,
- difference between 1 and 10 nm binding drug
 - 46 vs 52 kJ mol⁻¹
- topic will return later

Barrier crossing

How likely are you to cross a barrier?

• p_{red} vs p_{blue}



- all the blue copies of system will not make it over $E_{barrier}$
- red population is small, even for $E_{barrier} \sim kT$
- but explains why $\ln(rate) \propto T$

where next?

- how to see some of these properties by simulating
- how simulating depends on these properties