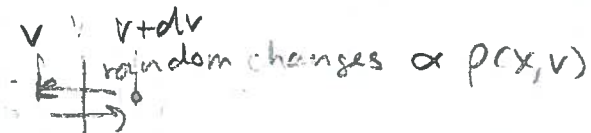


diffusion



Flux  $\propto p(v+dv) - p(v) \propto \frac{dp}{dv}$

$dp dv \propto dt \left[ \frac{dp}{dv}(v+dv) - \frac{dp}{dv}(v) \right]$

Stationary solution

$\rho \propto \exp(-\beta(V(x) + \frac{1}{2}mv^2))$  (Boltzmann factor)

$\frac{d}{dt} p(x,v) = 0 = (a(x) - \eta v) (-\beta m v) p - \eta p + v (-\beta V') p$   
 $+ \frac{d}{dv} (-\beta m v) p Dv$

$[a(x) - \eta v] (-\beta m v) p - \eta p + -\beta m p D + (-\beta m v)^2 p D$

$= p (\eta \beta m v^2 - \eta - \beta m D + \beta^2 m^2 v^2 D)$

$= 0$  if  $\eta = D \beta m$

$\Rightarrow$  correct ensemble averages enforced.

Nose-Hoover

Deterministic

Very common

additional variable  $s$  for heat bath

$H_{Nose} = M' + \frac{p_s^2}{2Q} + \frac{\log s}{\beta}$

$\frac{p_s^2}{2m_s^2} + U(r_1 \dots r_N)$   $p' = p/s$

$\mu(\gamma)$  is micro canonical, constant  $E, N, V$

$\delta [ H_{Nose} - E ]$  --- algebra --- integrating out  $s$

$\Rightarrow \langle A(p/s, r) \rangle_{Nose} = \langle A(p', r) \rangle_{NVT}$  canonical!

Moover rewrote it intelligently to make it easier to implement

Not Hamiltonian

$$\begin{cases} \dot{r}_i = p_i/m & \dot{p}_i = a(r_1 \dots r_N) - \xi p_i \\ \dot{\xi} = (\sum p_i^2 / m_i - \frac{L}{\beta}) / Q & \leftarrow \text{effective friction} \\ \dot{s} = \frac{d}{dt} \log s = \xi & \leftarrow \text{difference to temp you want,} \end{cases}$$

$\leftarrow$  redundant, but nice for checking  $(H_{Nose} \text{ conserved})$

Notes:  $-\log(s)$  was necessary to get correct behaviour

- necessary to have only one constant of motion, otherwise Nose-Hoover chains, (due to  $\delta$  function)

- global dependance.

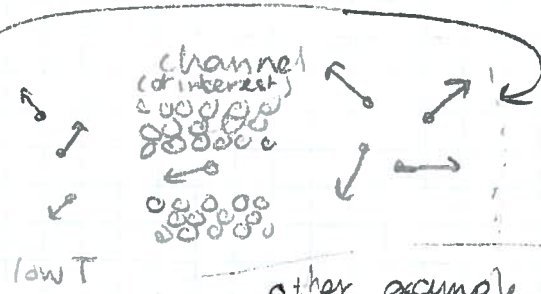
$\rightarrow$  thermostat coupled to more thermostats

# Applying Thermostats

- choose carefully. What is more realistic?
- where to apply? Far away from relevant dynamics.
- careful with out-of-equilibrium systems  
 $\mu(\gamma)$  is not the only thing that needs to be ok.
- There are other options (i.e. to damp phonons)

example

periodic



How would you thermostat this?

Will get exercises on thermostats!

How would you thermostat LJ Argon liquid?

other example



## Barostats etc.


scheme similar to Nosé-Hoover: include volume as variable. read the book section 6.2

In general: key to something-o-stat is to produce correct  $\mu(\gamma)$

Monte-Carlo (with randomness)

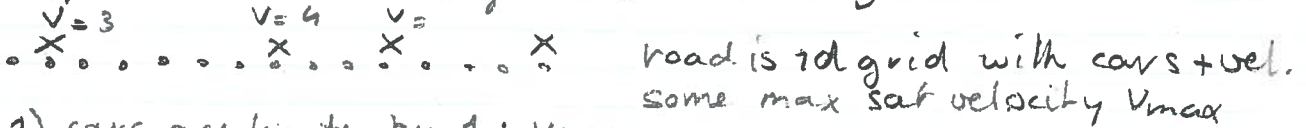
- direct MC, replace some physics by random process
- MC integration use to calculate integrals
- "metropolis" MC Markov chains (slightly blurry boundaries)

Direct MC: usually ad-hoc-ish

f.e random Lorentz gas  
draw random collision param for next scatterer 

f.e Langevin thermostat heat bath  $\rightarrow$  random noise + damping

f.e simple traffic model Nagel - Schreckenberg



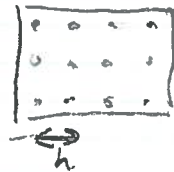
- 1) cars accelerate by 1:  $v_i++$
- 2) if distance to car in front  $(x_{i+1} - x_i) < v_i$ :  $v_i = x_{i+1} - x_i - 1$
- 3) with probability  $p$   $v_i--$  ← driver choice, or silliness or whatever
- 5) if  $v_i < 0$ :  $v_i = 0$

$\Rightarrow$  widely studied, + additions, explains a lot of qualitative behaviour of traffic jams     real traffic  $v_{max} \approx 5$

MC integration

$\int dx f(x)$   
↑ smooth

hopefully from num. methods course



- usual integration methods based on regular grid to improve: points closer together (decrease  $h$ ) (methods described in Thyssen's appendix)  $O(h^k)$  for some  $k$ .

- MC: instead of grid, random points after  $N$  points error  $= O(1/\sqrt{N})$



$\int dx f(x)$   
 $\approx$  area  $\langle f(x) \rangle$   
 $\approx \frac{1}{N} \sum_{i=1}^N f(x_i)$

in  $d$  dimension:

grid:  $N \propto (\frac{1}{h})^d$  ← high dimensional  $\Rightarrow$  many points  
error  $O(\frac{1}{N})^{k/d}$

MC  $O((\frac{1}{N})^{1/2})$

$\Rightarrow$  if  $k/d < 1/2$  MC is better