

# Čestični metodi za simulacije kompleksnih sistema

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# Različiti pristupi u modelovanju

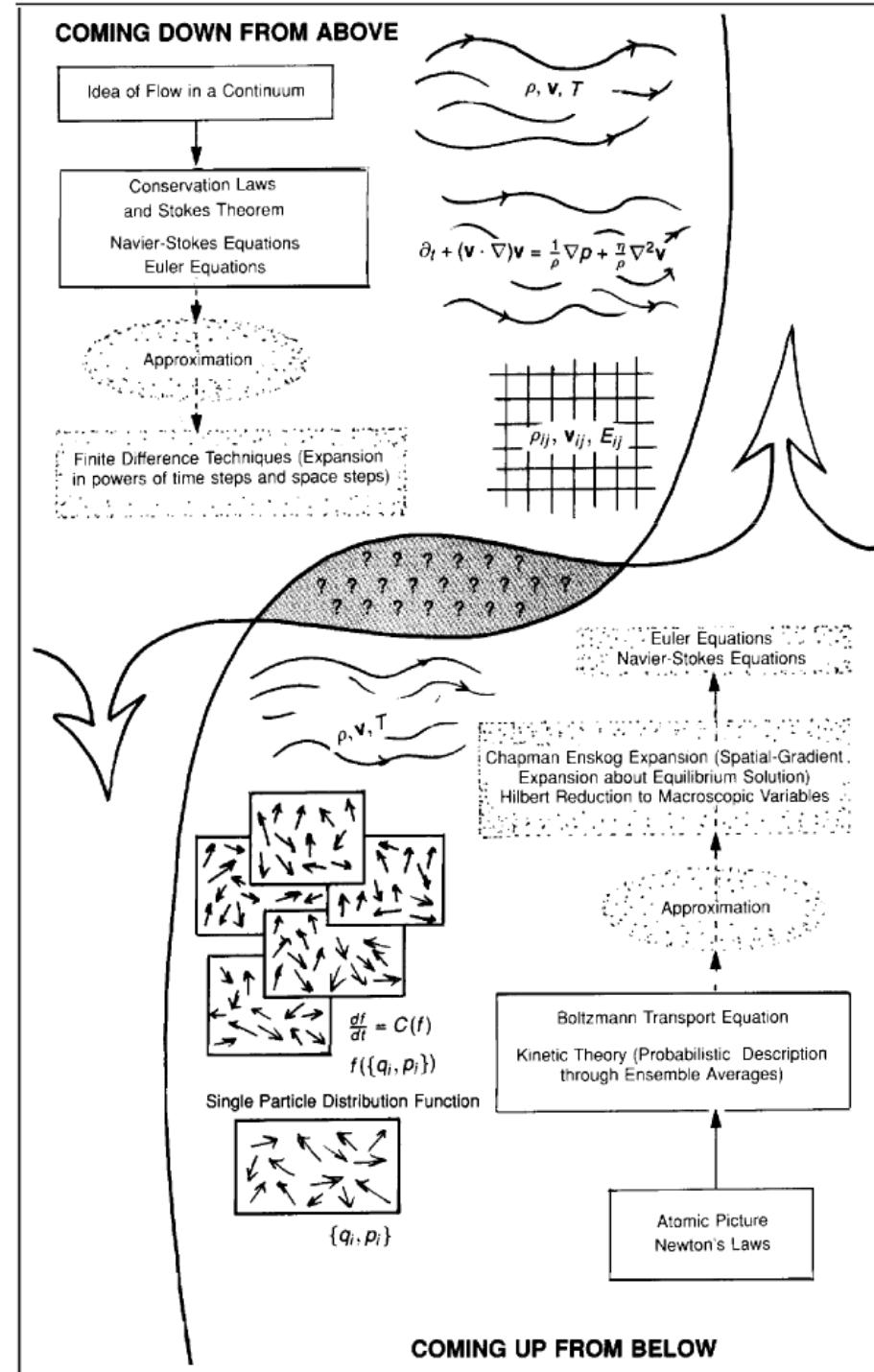


Fig. 2. Both the continuum view of fluids and the atomic picture lead to the Navier-Stokes equations but not without approxima-

tions (dashed lines). The text emphasizes how cellular-automaton models embody the essentials of both points of view.

# Mehanika fluida - ukratko

Posmatrani element  $\Sigma$  mora biti dovoljno

- (1) veliki da molekularna strukutra može da se zameni kontinualnim modelima
- (2) dovoljno mali da bi bio matematički prihvatljiv

onda geometrijskih razmatranja +  $\oint_{\partial\Sigma} \mathbf{A} \cdot d\mathbf{l} = \oint_{\Sigma} \nabla \times \mathbf{A} \cdot d\mathbf{S}$  &  $\oint_{\partial\Sigma} \mathbf{A} \cdot d\mathbf{S} = \int_{\Sigma} \nabla \cdot \mathbf{A} dV$   
dobija se:

$$\overbrace{\oint_{\partial\Sigma} \rho \mathbf{v} \cdot d\mathbf{S}}^{flux of mass} = -\partial_t \int_{\Sigma} \rho dV \xrightarrow[\Sigma \rightarrow 0]{} \boxed{\partial_t \rho + \nabla \cdot (\rho \mathbf{v}) = 0} \quad \begin{matrix} \text{jednačina} \\ \text{kontinuiteta} \end{matrix}$$

pritisak je sila na jedinicu zapremine

$$\begin{aligned} -\oint_{\partial\Sigma} p d\mathbf{S} &= -\int_{\Sigma} \nabla p dV \xrightarrow[\Sigma \rightarrow 0]{} -\nabla p = \rho \frac{d\mathbf{v}}{dt} \xrightarrow{} \boxed{\partial_t \mathbf{v} + (\mathbf{v} \cdot \nabla) \mathbf{v} = -\frac{1}{\rho} \nabla p} \quad \begin{matrix} \text{Eulerova} \\ \text{jednačina} \end{matrix} \\ \mathbf{F} = m \mathbf{a} &= \int_{\Sigma} \rho \frac{d\mathbf{v}}{dt} dV \end{aligned}$$

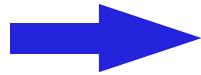


$$\boxed{\partial_t \mathbf{v} + (\mathbf{v} \cdot \nabla) \mathbf{v} = -\frac{1}{\rho} \nabla p + \nu \nabla^2 \mathbf{v}} \quad \begin{matrix} \text{Navier-Stoksova} \\ \text{jednačina} \end{matrix}$$

# Mehanika fluida - ukratko

$$\partial_t \rho + \nabla \cdot (\rho \mathbf{v}) = 0$$

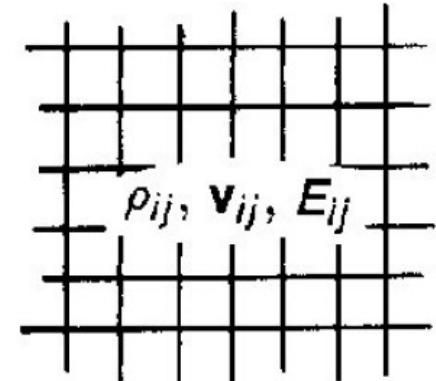
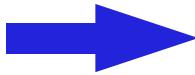
$$\partial_t \mathbf{v} + (\mathbf{v} \cdot \nabla) \mathbf{v} = -\frac{1}{\rho} \nabla p + \nu \nabla^2 \mathbf{v}$$



$$(\partial_t f)_{ij}^n \approx \frac{f_{i,j}^{n+1} - f_{i,j}^n}{\Delta t}$$

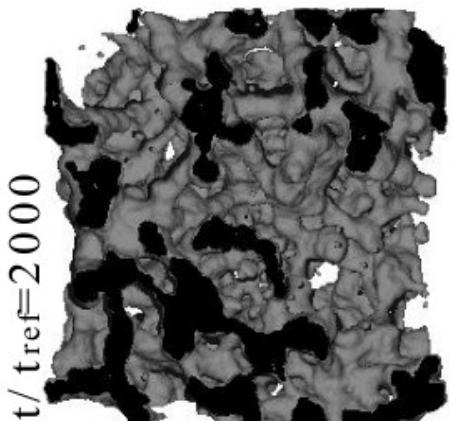
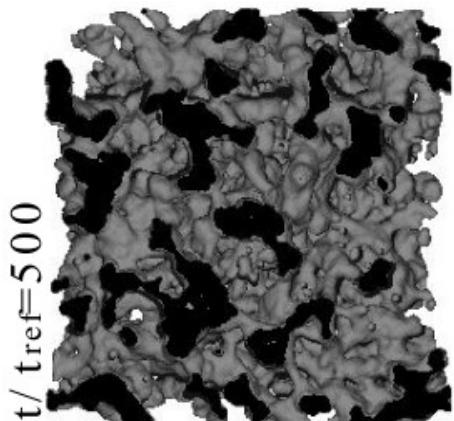
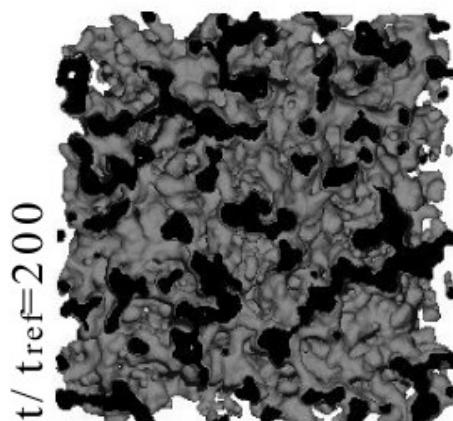
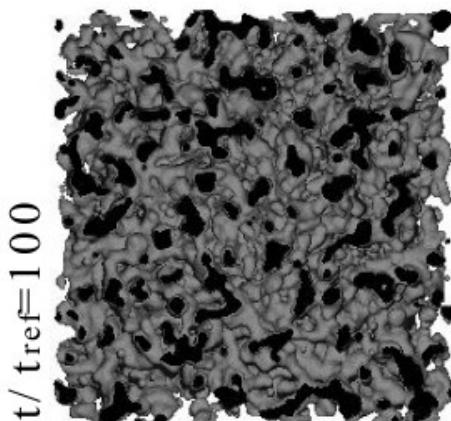
$$(\nabla_x f)_{ij}^n \approx \frac{f_{i+1,j}^n - f_{i-1,j}^n}{\Delta x}$$

$$(\nabla_x^2 f)_{ij}^n \approx \frac{f_{i+1,j}^n - 2f_{i,j}^n + f_{i-1,j}^n}{2\Delta x^2}$$



rešite diskretizovane  
numeričke jednačine na  
mreži tačaka

## Šta ne može da reši mehanika fluida



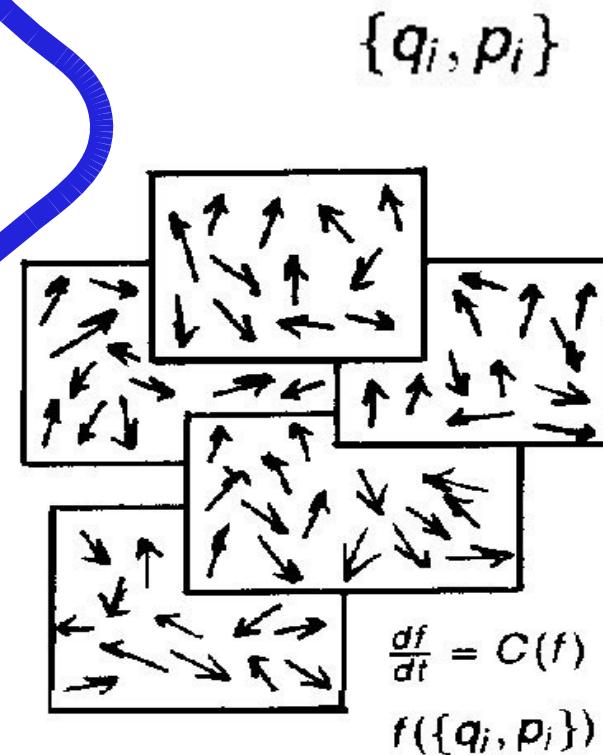
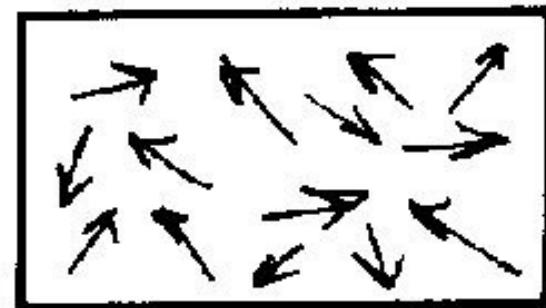
## Pristup na malim skalam - ukratko

Čestice, atomi ili molekuli interaguju preko klasičnih (ili kvantnih) potencijala

$$\dot{\mathbf{r}}_i = \mathbf{v}_i$$
$$\dot{\mathbf{v}}_i = -\nabla_i U(\mathbf{r}_1, \dots, \mathbf{r}_N)$$

$$\langle n(\mathbf{r}, t) \rangle = \int f(t, \mathbf{r}, \mathbf{v}) d\mathbf{v}$$
$$\langle \mathbf{V}(\mathbf{r}, t) \rangle = (1/\langle n \rangle) \int f(t, \mathbf{r}, \mathbf{v}) \mathbf{v} d\mathbf{v}$$

srednje vrednosti iz jednočestične funkcije raspodele



Single Particle Distribution Function

# Postoji li direktni prelaz iz kontinualnih u čestične modele

## molekularni:

- neravnotežna molekularna dinamika (NEMD)
- Monte Karlo (MC)

## mezoskopski metodi:

- Bolcmanovu jednačinu na rešetci (LB)
- braunovska dinamike (BD),
- disipativna čestična dinamika (DPD)

## makroskopski metodi:

- hidrodinamika ujednačenih čestica (SPH)

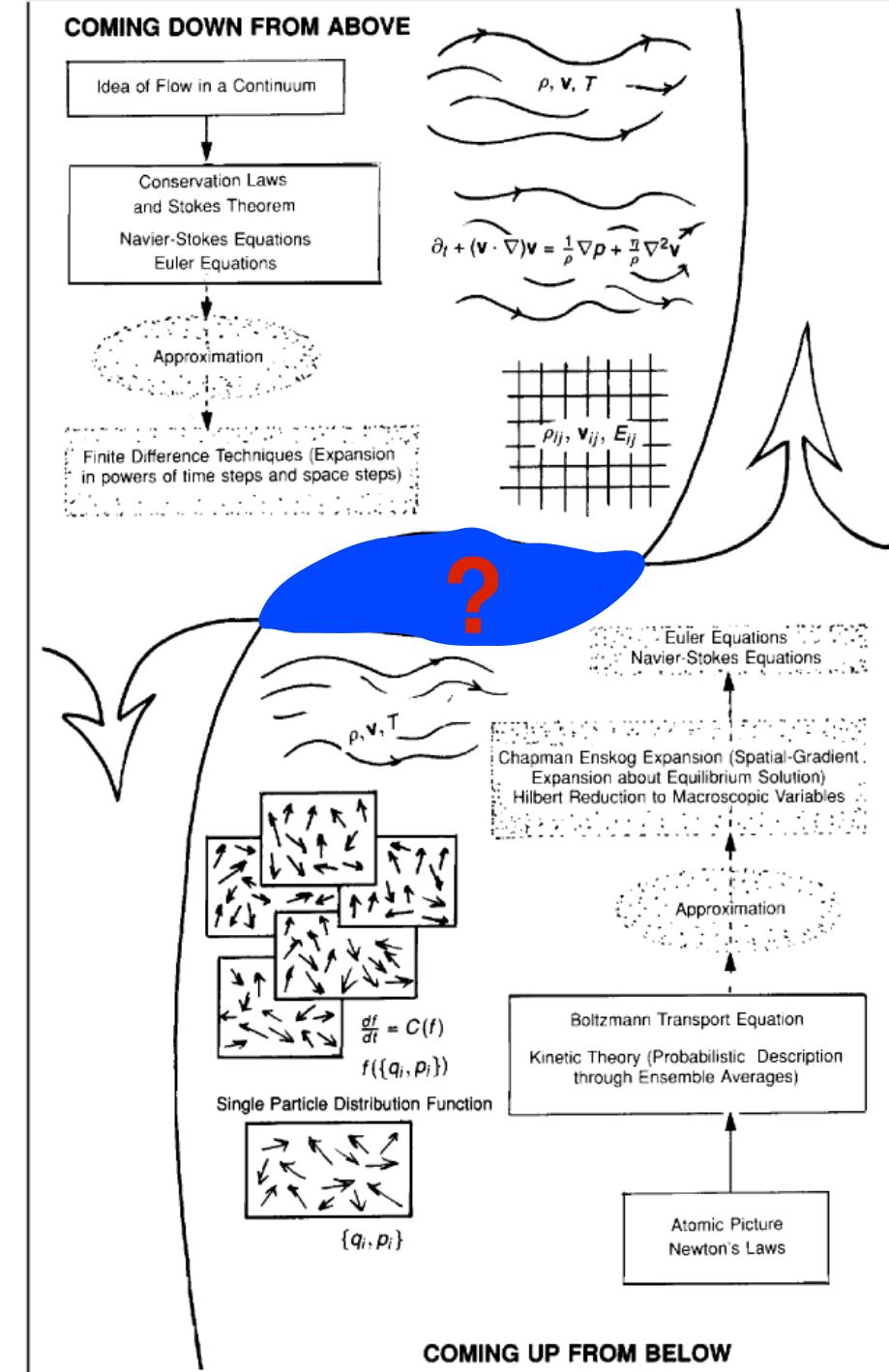


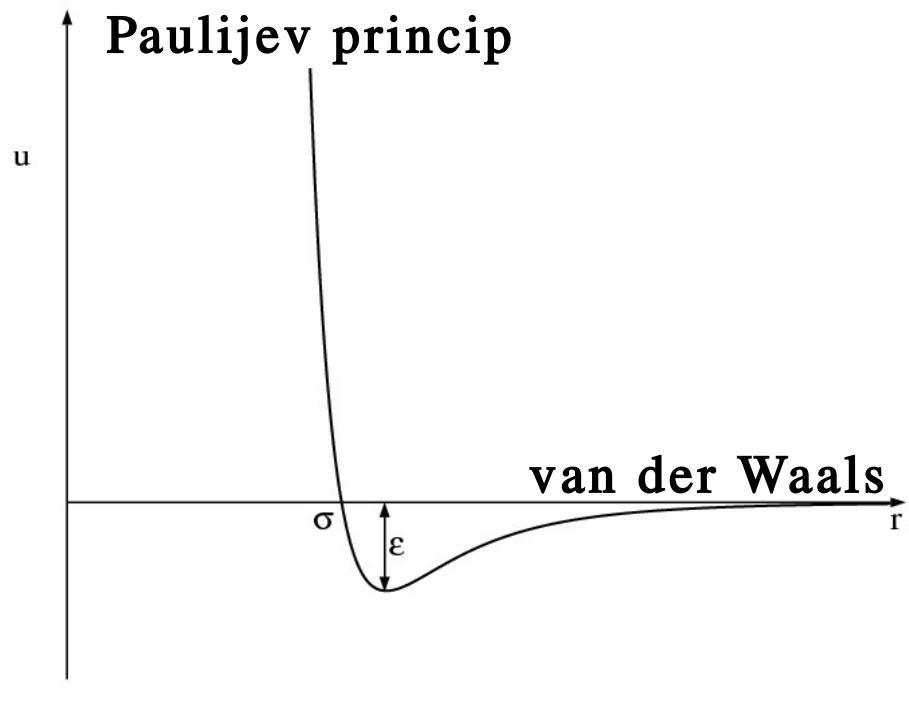
Fig. 2. Both the continuum view of fluids and the atomic picture lead to the Navier-Stokes equations but not without approximations (dashed lines). The text emphasizes how cellular-automaton models embody the essentials of both points of view.

# Metod molekularne dinamike

molekuli, atomi

$$V(\mathbf{r}_1, \mathbf{r}_2, \dots, \mathbf{r}_N) = \sum_i \sum_{j>i} \phi(|\mathbf{r}_i - \mathbf{r}_j|)$$

$$\phi_{LJ}(r) = 4\epsilon \left[ \left( \frac{\sigma}{r} \right)^{12} - \left( \frac{\sigma}{r} \right)^6 \right]$$



$\dot{\mathbf{r}}_i = \mathbf{v}_i$

$\dot{\mathbf{v}}_i = -\nabla_i V(\mathbf{r}_1, \dots, \mathbf{r}_N)$

metali, poluprovodnici

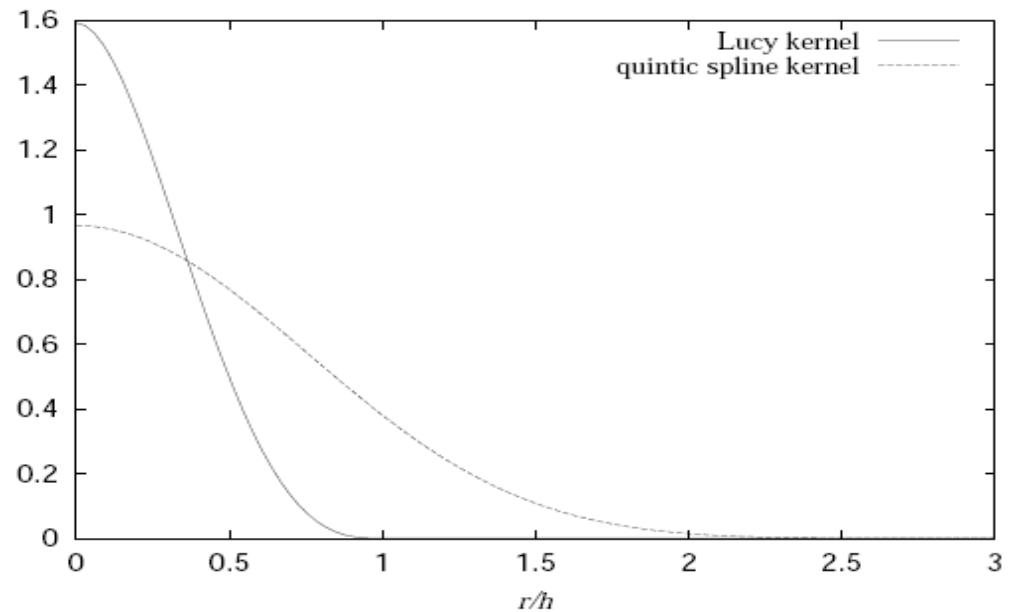
$$V(\mathbf{r}_1, \mathbf{r}_2, \dots, \mathbf{r}_N) = \sum_i \left( \sum_{j>i} \phi(|\mathbf{r}_i - \mathbf{r}_j|) + \Theta(\rho_i) \right)$$

$$\Theta(\rho_i) = \phi_0 \sum_{k=2,4,\dots} r_0^3 k F_k ((\rho_i - \rho_{des})^k - (w(0) - \rho_{des})^k)$$

lokalna gustina

$$\rho_i = \sum_j w(r_{ij})$$

$$w(r) = w_0 \left( 1 + 3 \frac{r}{r_{cut}} \right) \left( 1 - \frac{r}{r_{cut}} \right)^3$$



# Metod molekularne dinamike

$$V(t) = \sum_i \sum_{j>i} \phi(|\mathbf{r}_i(t) - \mathbf{r}_j(t)|)$$
 potencijalna energija

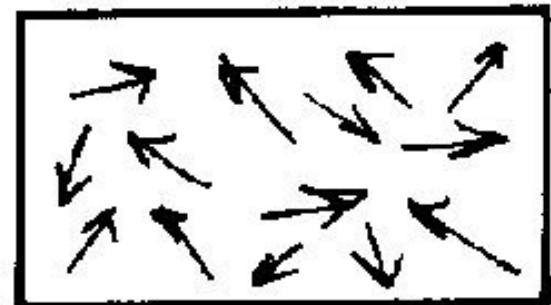
$$K(t) = \frac{1}{2} \sum_i m_i [v_i(t)]^2$$
 kinetička energija

$$E(t) = K(t) + V(t)$$

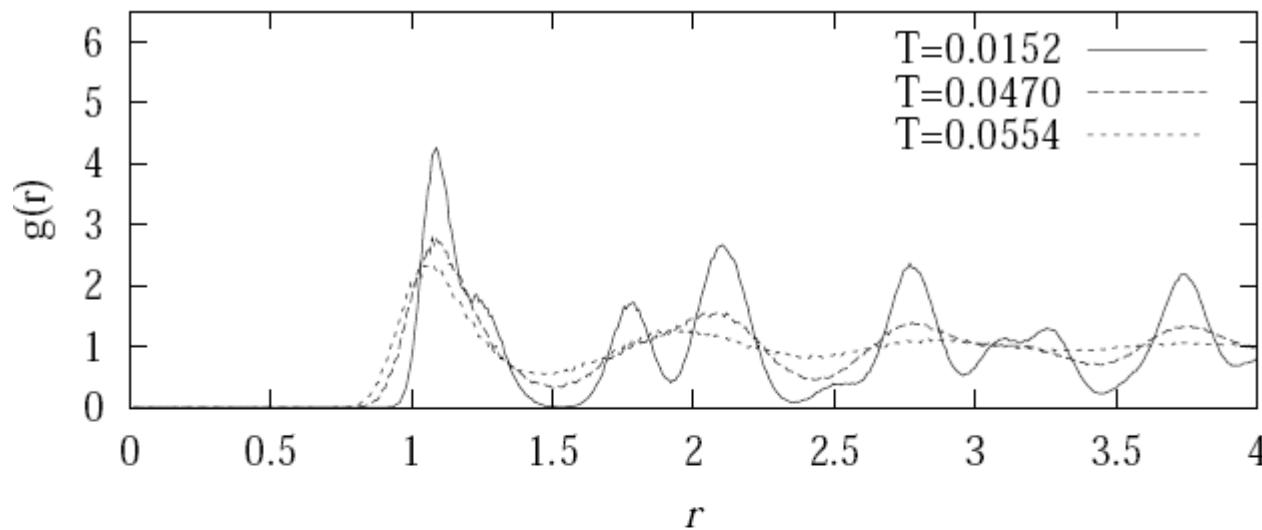
$$K(t) = \frac{3}{2} N k_B T(t)$$
 temperatura

$$PV = N k_B T - \frac{1}{3} \left\langle \sum_i \mathbf{r}_i \cdot \mathbf{F}_i \right\rangle$$
 pritisak

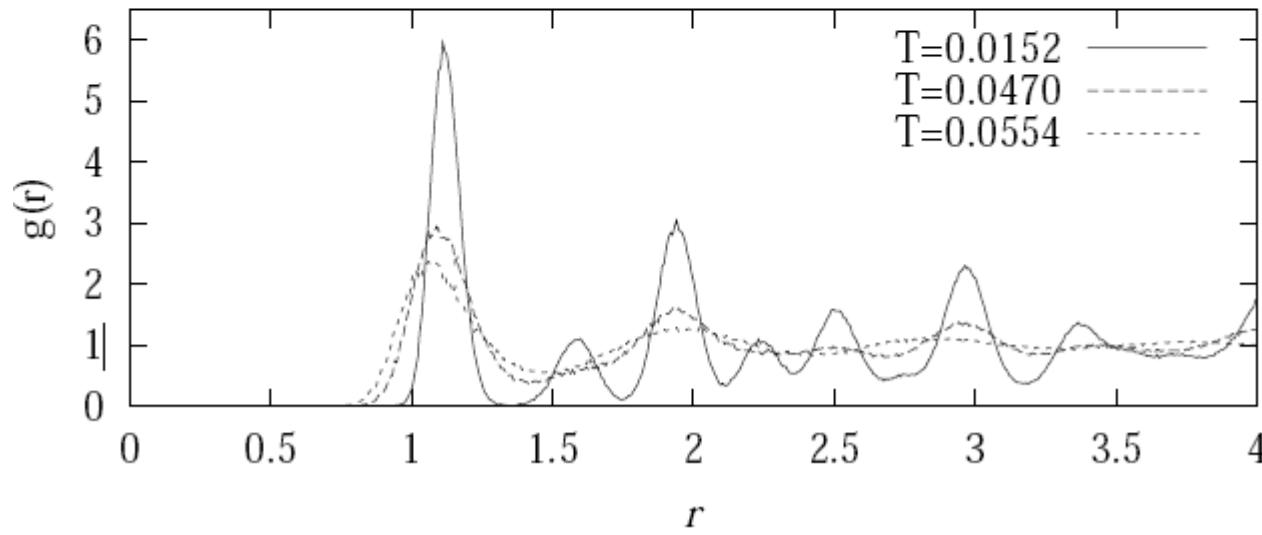
$$D = \lim_{t \rightarrow \infty} \frac{1}{6t} \left\langle |\mathbf{r}(t) - \mathbf{r}(0)|^2 \right\rangle$$
 koeficijent difuzije



# Metod molekularne dinamike



a) body-centered cubic structure



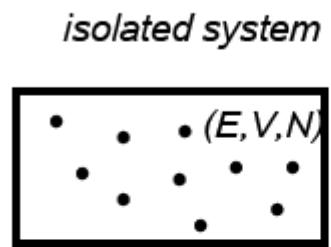
b) face-centered cubic structure

$$\rho g(r) = \frac{1}{N} \left\langle \sum_i \sum_{j \neq i} \delta(r - r_{ij}) \right\rangle$$

dvočestična funkcija  
raspodele

# Metod molekularne dinamike

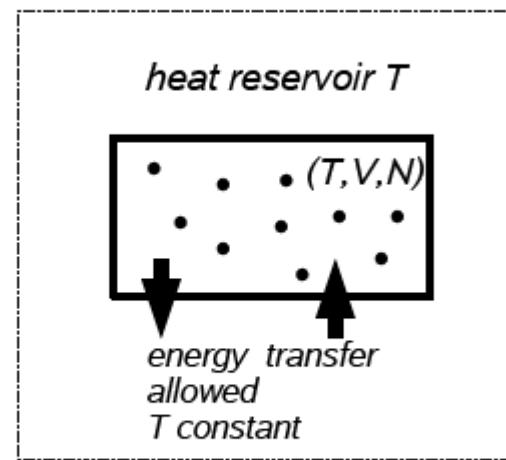
- Microcanonical ensemble



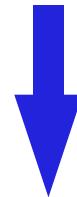
*energy transfer not allowed  
E constant*

$$f(\Gamma) = \delta(H(\Gamma) - E)$$

- Canonical ensemble



$$f(\Gamma) = \exp(-H(\Gamma)/k_B T)$$



potrebne su dodatne  
jednačine

# Metod molekularne dinamike

## Nose-Hoover termostat

$$\dot{\mathbf{r}}_i = \frac{\mathbf{p}_i}{m_i}$$

$$\dot{\mathbf{p}}_i = -\nabla_i V - \zeta \mathbf{p}_i$$

$$\dot{\zeta} = \frac{\left( \sum_i \frac{\mathbf{p}_i^2}{m_i} - g k_B T \right)}{Q} = \mathcal{V}_T \left[ \frac{\sum_i \frac{\mathbf{p}_i^2}{m_i}}{g k_B T} - 1 \right] = \mathcal{V}_T \left[ \frac{T^*}{T} - 1 \right]$$

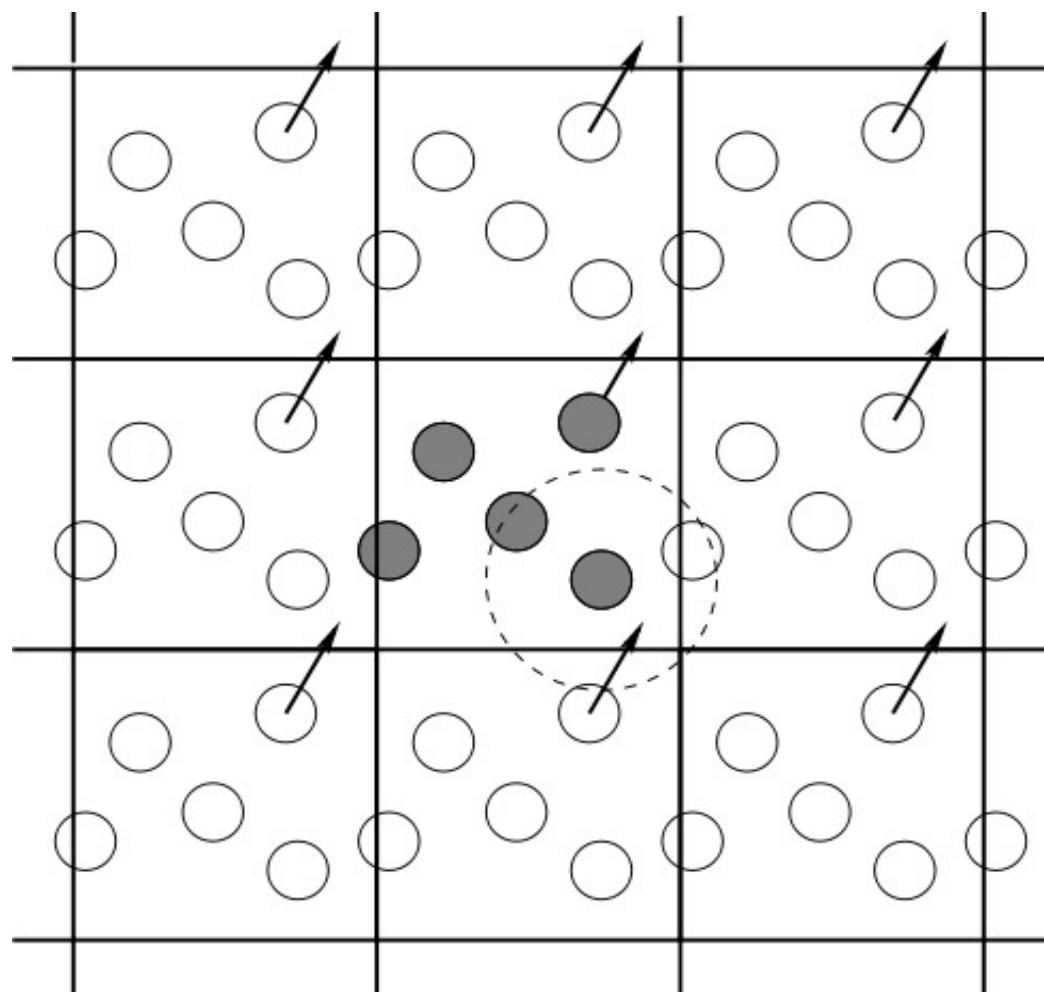
## Woodcock termostat

$$\hat{\mathbf{v}}_i \left( t + \frac{\Delta t}{2} \right) = S \mathbf{v}_i \left( t + \frac{\Delta t}{2} \right)$$



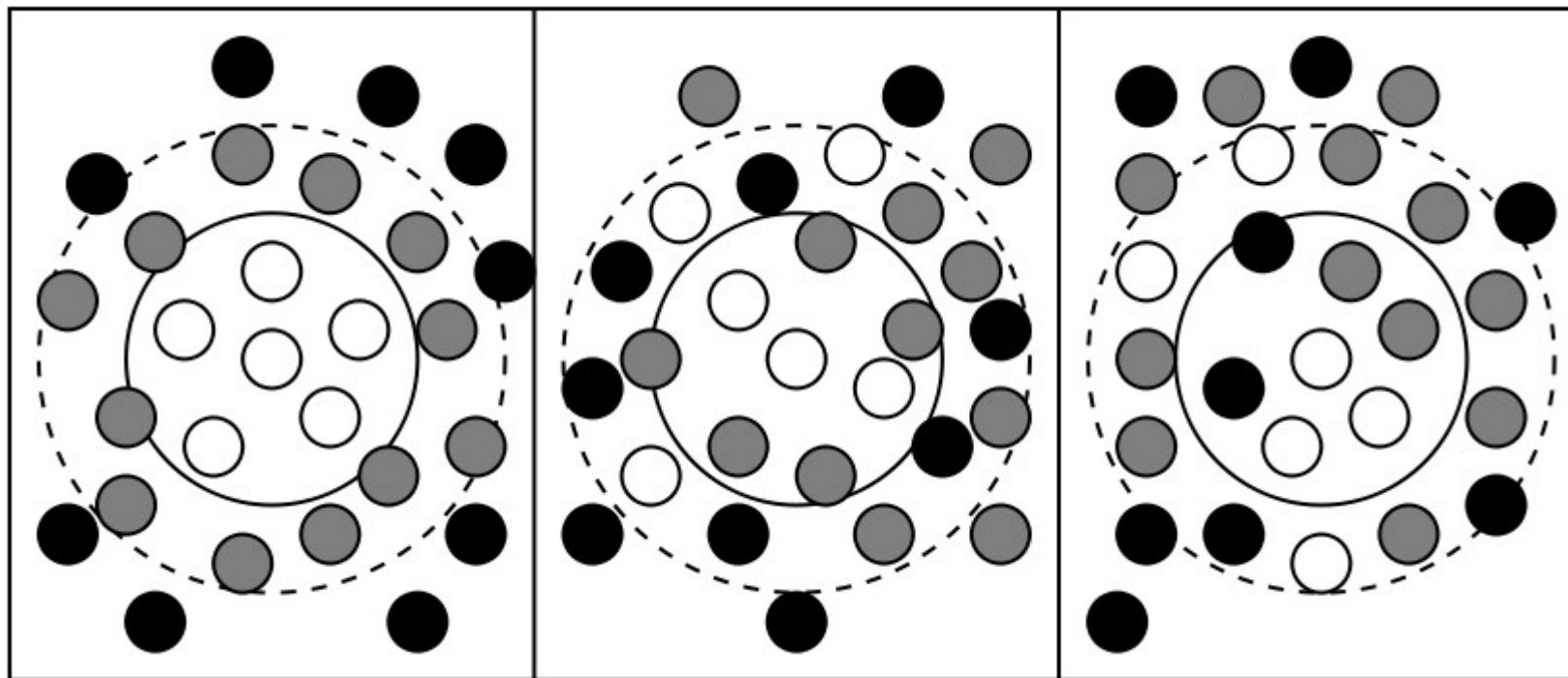
$$S = \left[ \frac{\frac{3}{2} N k_B T}{\sum_i \frac{m_i}{2} \left[ \mathbf{v}_i \left( t + \frac{\Delta t}{2} \right) \right]^2} \right]^{1/2}$$

# Metod molekularne dinamike



periodični granični uslovi

## Metod molekularne dinamike



liste suseda za smanjivanje kompleksnosti problema

# Mehanika fluida - ukratko

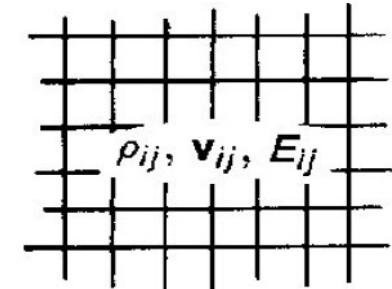
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## Hidrodinamika ujednačenih čestica (SPH)

$$\langle f(\mathbf{x}) \rangle = \int_{\Omega} f(\mathbf{x}') W(\mathbf{x} - \mathbf{x}', h) d\mathbf{x}'$$

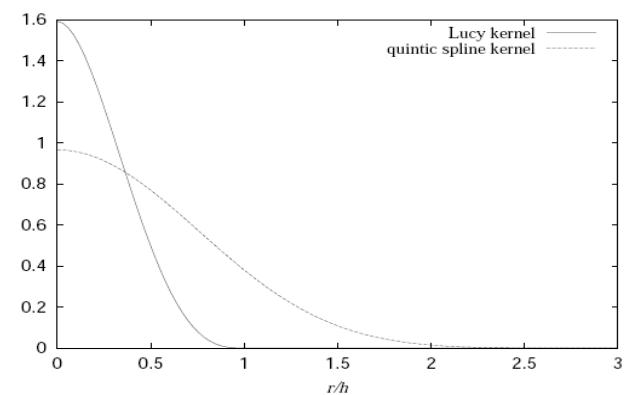
$$\int_{\Omega} W(\mathbf{x} - \mathbf{x}', h) d\mathbf{x}' = 1,$$

$$\lim_{h \rightarrow 0} W(\mathbf{x} - \mathbf{x}', h) = \delta(\mathbf{x} - \mathbf{x}')$$

$$n(\mathbf{x}) = \sum_j \delta(\mathbf{x} - \mathbf{x}_j)$$

$d\mathbf{x}$  je zamenjen  
zapreminom čestice

$$d\mathbf{x}' \rightarrow \phi_j \equiv \frac{m_j}{\rho_j}$$



# Hidrodinamika ujednačenih čestica (SPH)

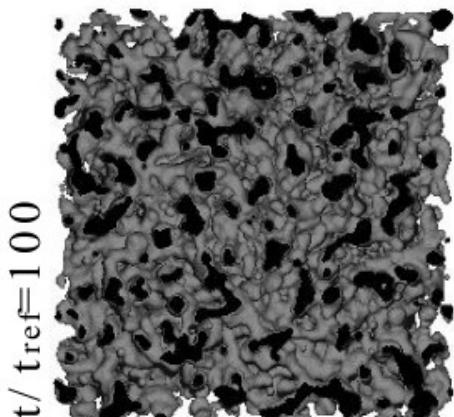
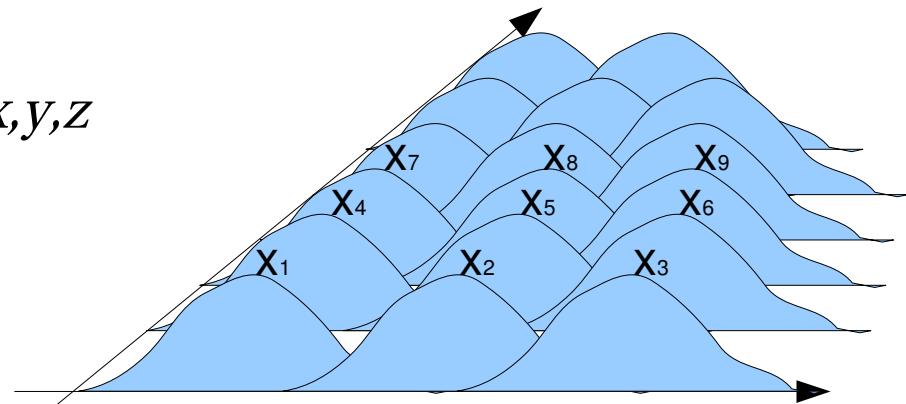
$$\frac{\partial V^\alpha}{\partial t} + (V^\beta \nabla^\beta) V^\alpha = \frac{1}{\rho} \nabla^\beta P^{\alpha\beta}, \quad \alpha, \beta = x, y, z$$



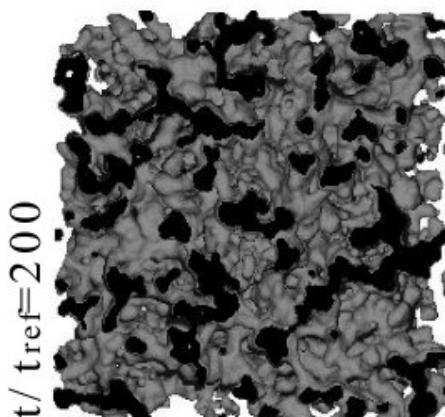
$$\int_{\Omega} \left( \frac{\partial V^\alpha}{\partial t} + (V^\beta \nabla'^\beta) V^\alpha \right) W(|\mathbf{x} - \mathbf{x}'|, h) d\mathbf{x}' = \int_{\Omega} \left( \frac{1}{\rho} \nabla'^\beta P^{\alpha\beta} \right) W(|\mathbf{x} - \mathbf{x}'|, h) d\mathbf{x}'$$



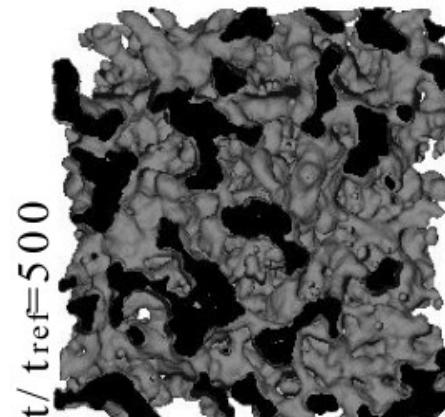
$$\frac{dV_i^\alpha}{dt} = \sum_j m_j \left( \frac{P_i^{\alpha\beta}}{\rho_i^2} + \frac{P_j^{\alpha\beta}}{\rho_j^2} \right) \nabla_i^\alpha W_{ij}$$



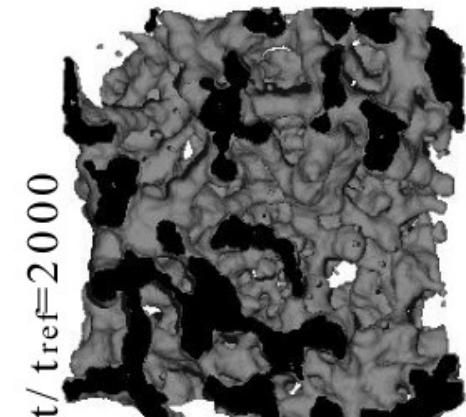
$t/t_{ref}=100$



$t/t_{ref}=200$



$t/t_{ref}=500$

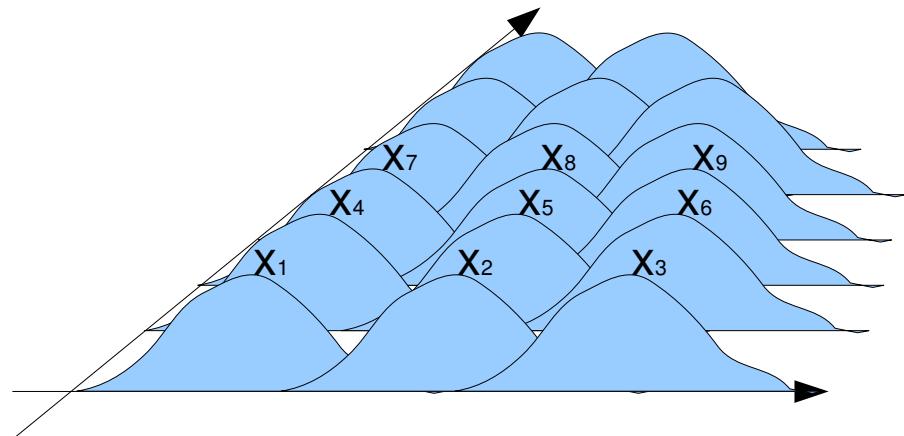


$t/t_{ref}=2000$

# Hidrodinamika ujednačenih čestica (SPH)

$$\frac{dV_i^\alpha}{dt} = \sum_j m_j \left( \frac{P_i^{\alpha\beta}}{\rho_i^2} + \frac{P_j^{\alpha\beta}}{\rho_j^2} \right) \nabla_i^\alpha W_{ij}$$

$$P \sim \rho^2$$



$$\dot{\mathbf{r}}_i = \mathbf{v}_i$$

$$\dot{\mathbf{v}}_i = -\nabla_i V(\mathbf{r}_1, \dots, \mathbf{r}_N)$$

# Kako integrisati dve skale?

$$\frac{dV_i^\alpha}{dt} = \sum_j m_j \left( \frac{P_i^{\alpha\beta}}{\rho_i^2} + \frac{P_j^{\alpha\beta}}{\rho_j^2} \right) \nabla_i^\alpha W_{ij}$$

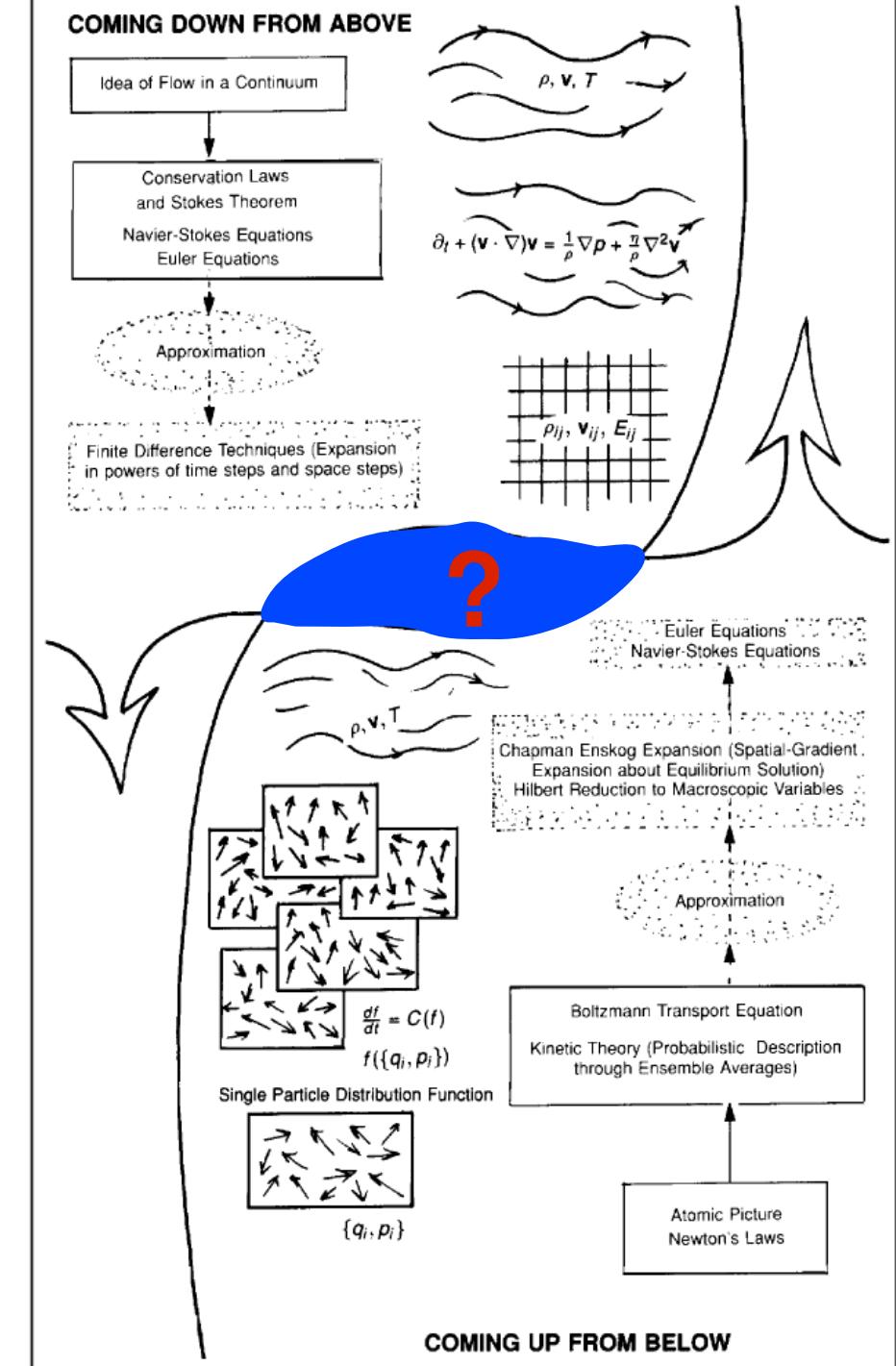
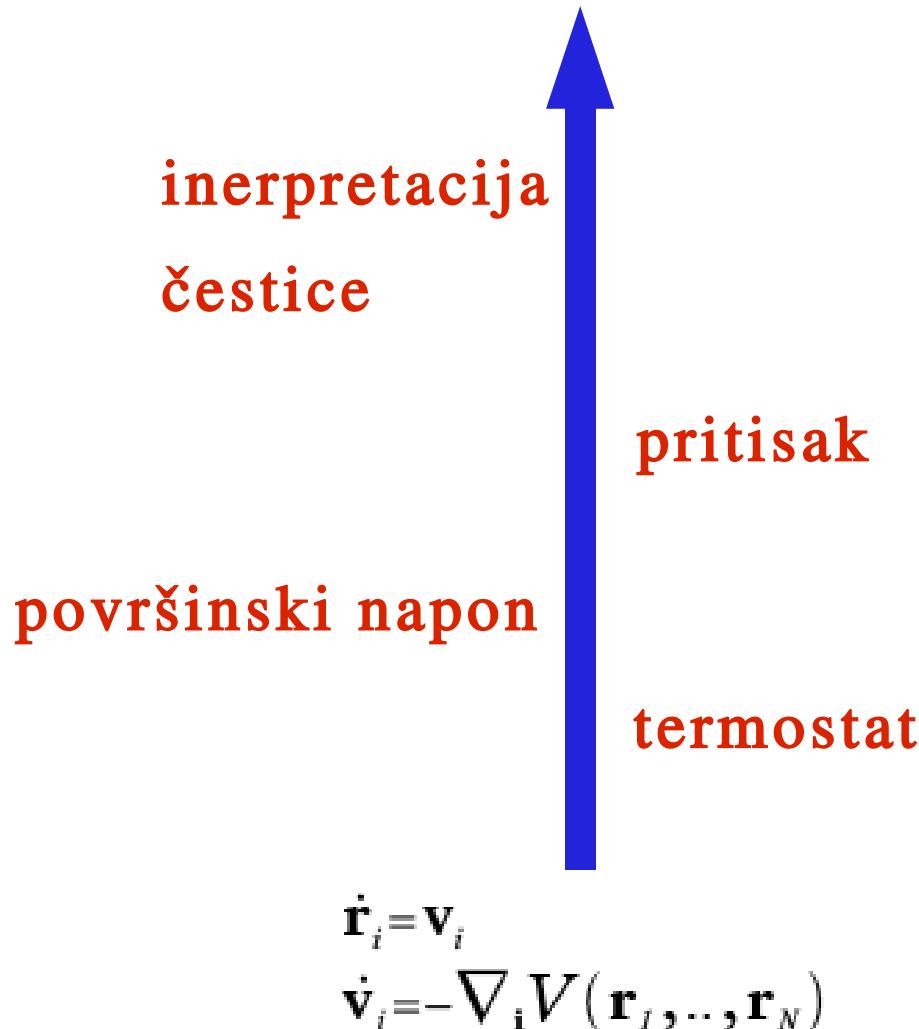
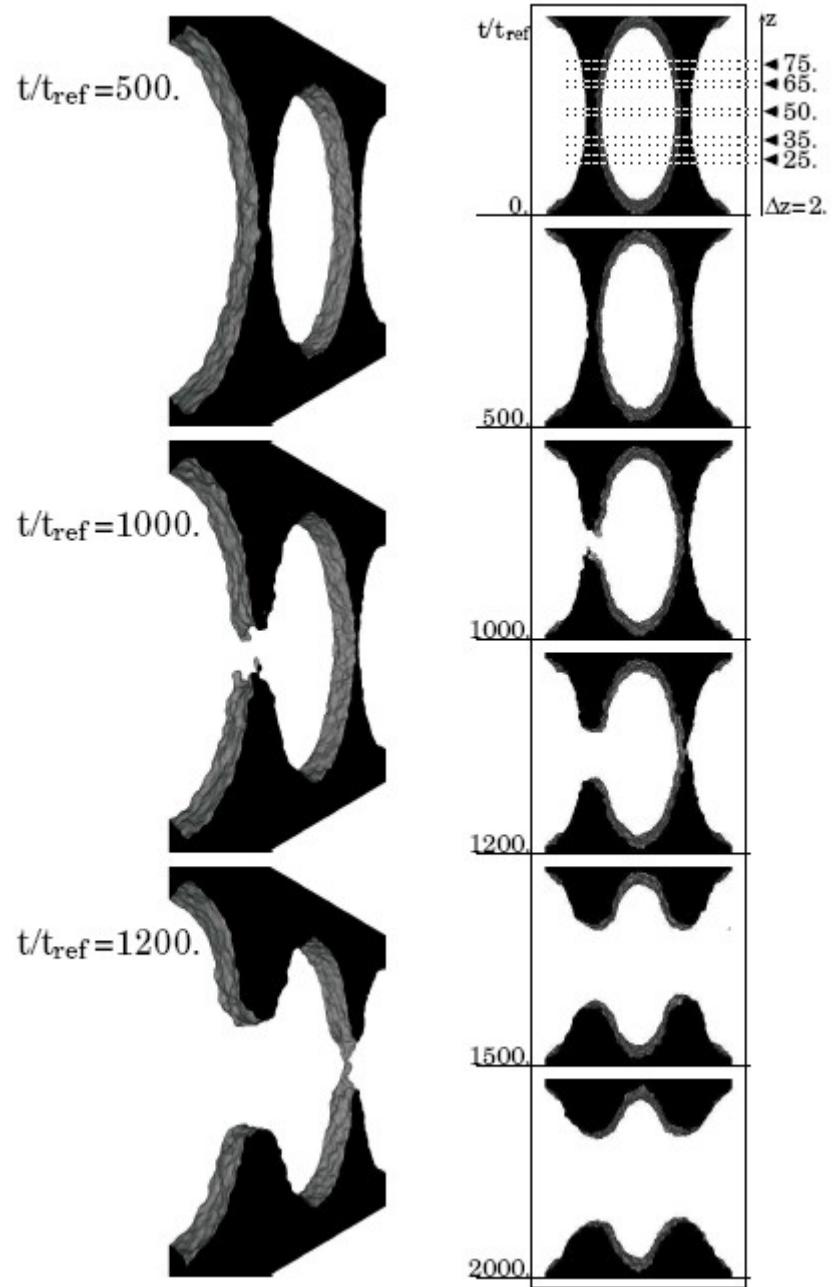
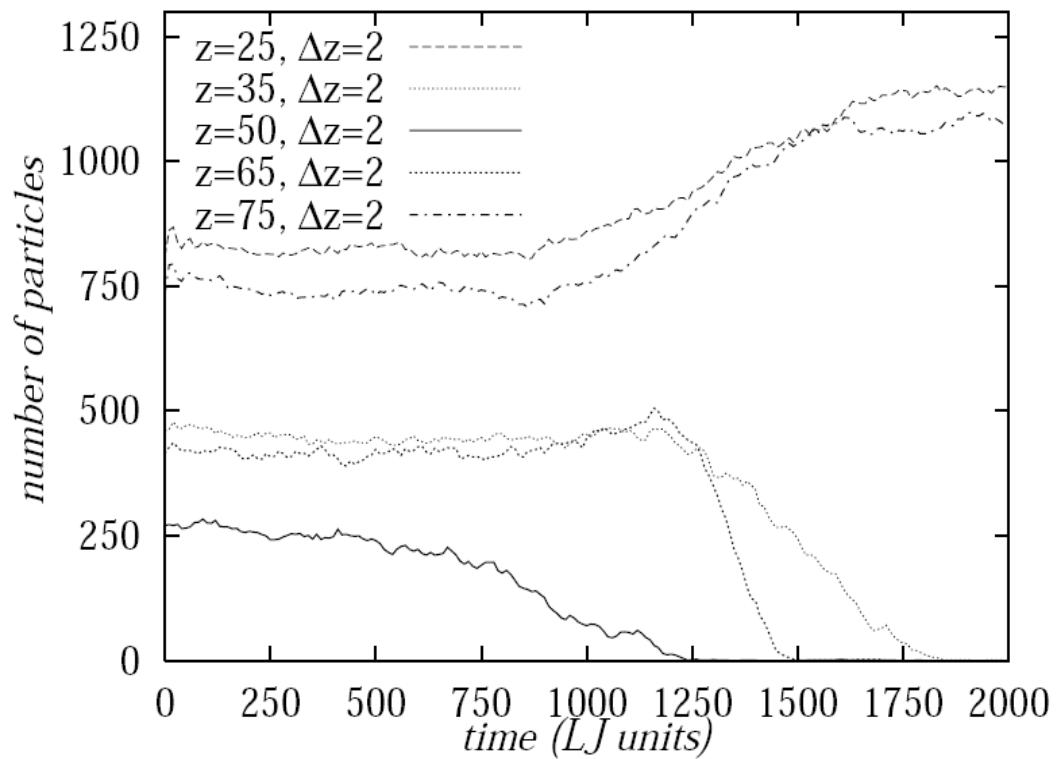
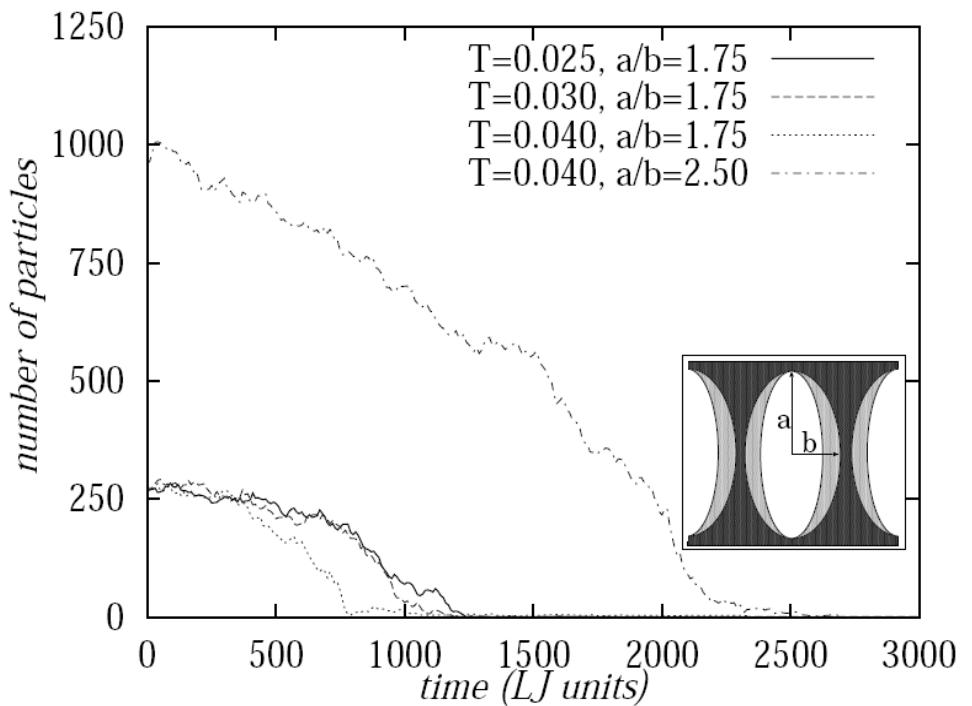
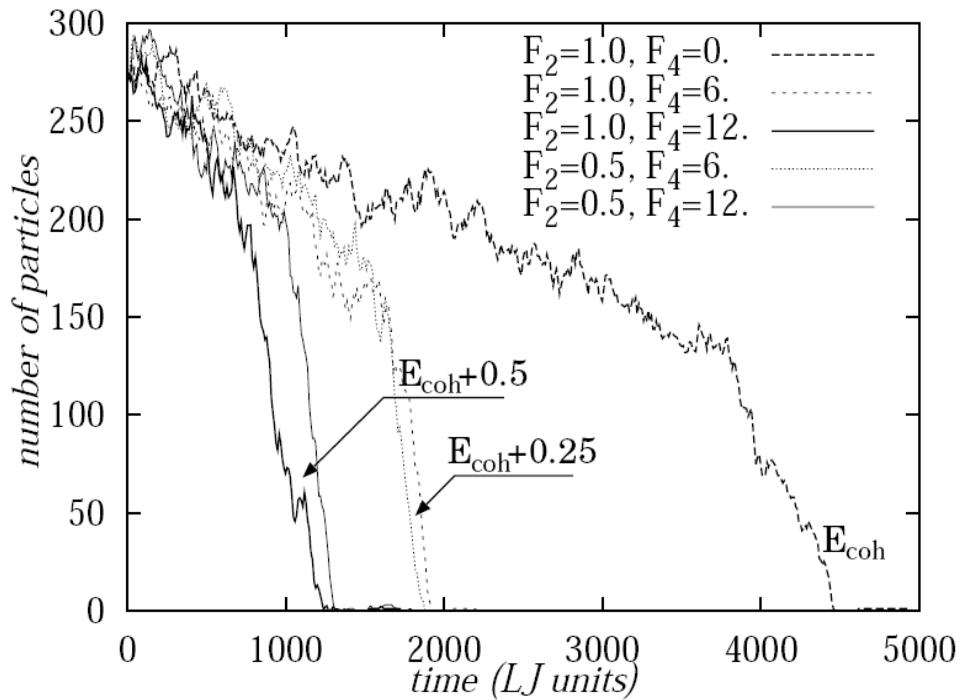


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# Kako integrisati dve skale?



# Kako integrisati dve skale?



system (atoms)	$r_{ref}$ (nm)	$E_{ref}, k_B T$	$\Gamma_{ref}$ (erg/cm <sup>2</sup> )	$P_{ref}$	$t_{ref}$
embedded atoms (8)	0.24 0.48	3.45eV, 40kK 27.6eV	0.96 1.92		$0.97 \times 10^{-13}$ s $1.9 \times 10^{-13}$ s
embedded particles (64) (500)	0.96 1.92	0.2keV 1.8keV	3.83 7.67	40GPa	$3.9 \times 10^{-13}$ s $7.8 \times 10^{-13}$ s
	3.84	14keV	15.3		$0.97 \times 10^{-12}$ s