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MODERN MODELING TECHNIQS (DEM, POPULATION BALANCE, FRACTIONAL CALCULUS) IN THE ANALYSIS OF GRANULAR FLOWS

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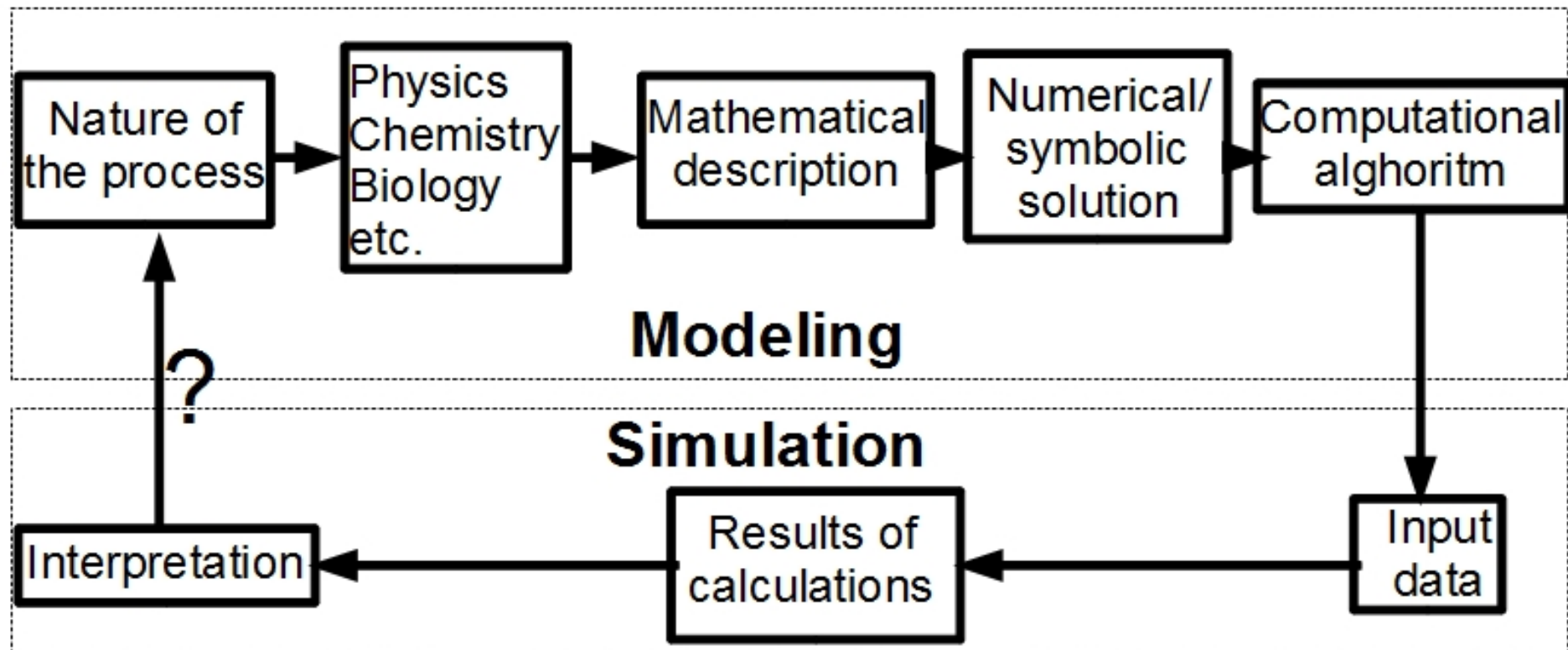


IEA meeting, October 7-9, 2009, Czestochowa, Poland

PART 0:

Introduction

The origin of modeling and simulation¹

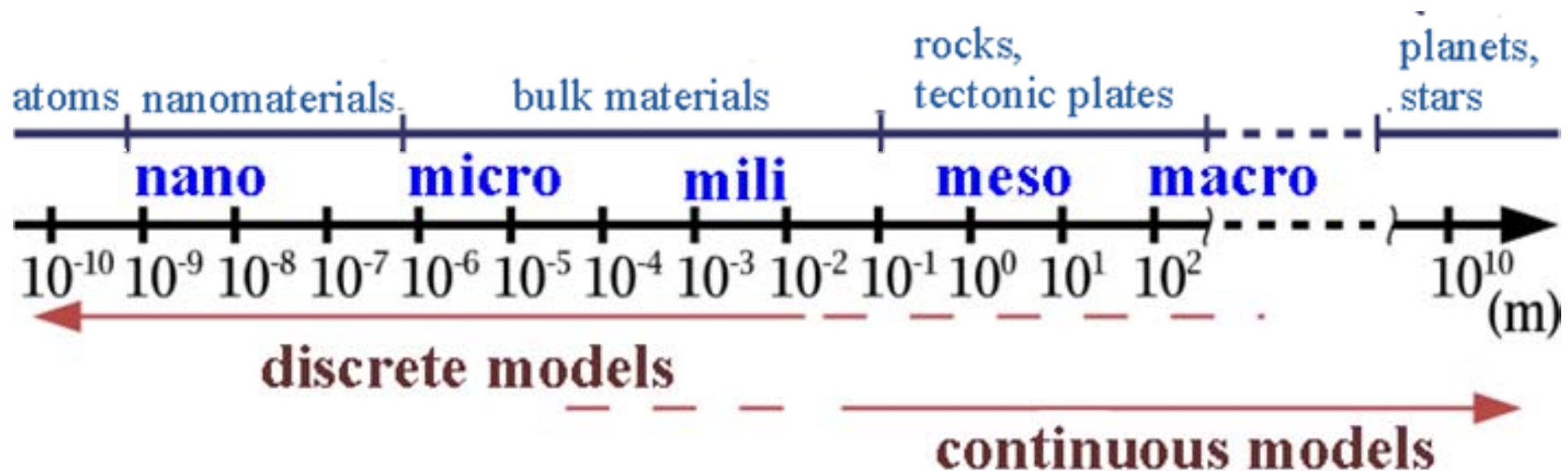


¹ Leszczyński J.S., O modelowaniu i symulacji na maszynach cyfrowych, Materiały Sympozjum Naukowego Instytutu Matematyki i Informatyki, Częstochowa-Poraj, 2000, 69-74.

Introduction

Granular matter is a set of objects called particles. From the multiscale point of view particles characterise by different: sizes, shapes and their physical properties and parameters describing their state of surface, i.e. the surface roughness, viscosity, etc. The existence of interparticle frictions, inelastic collisions between particles and thermal fluctuations in nanoparticles makes this granular matter to be defined as additional state of matter¹.

Granular materials^{2,3}



¹ Jaeger H.M., Nagel S.R., Behringer R.P., Granular solids, liquids and gases, *Reviews of Modern Physics* **68**(4), 1996, 1259-1273.

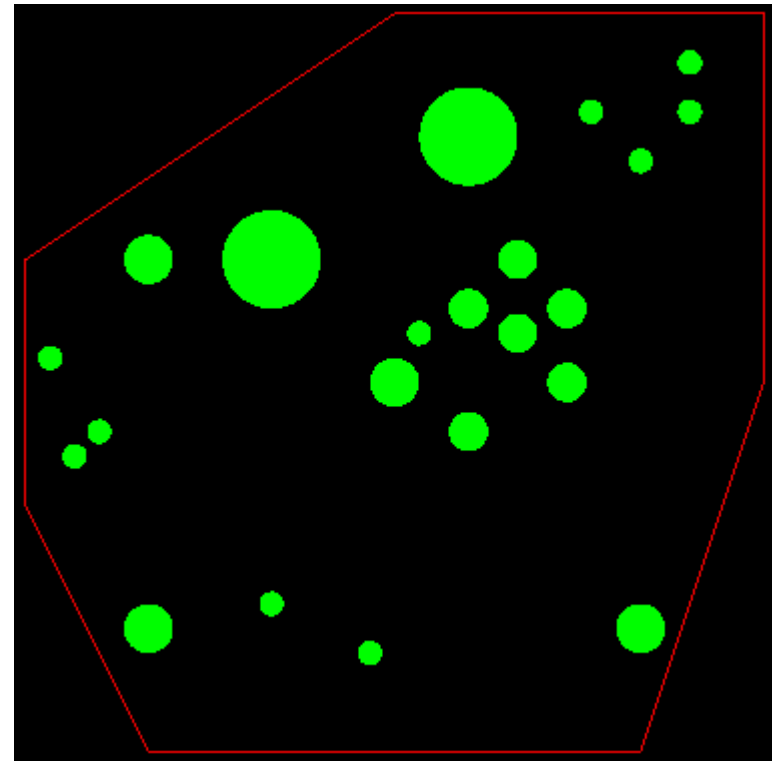
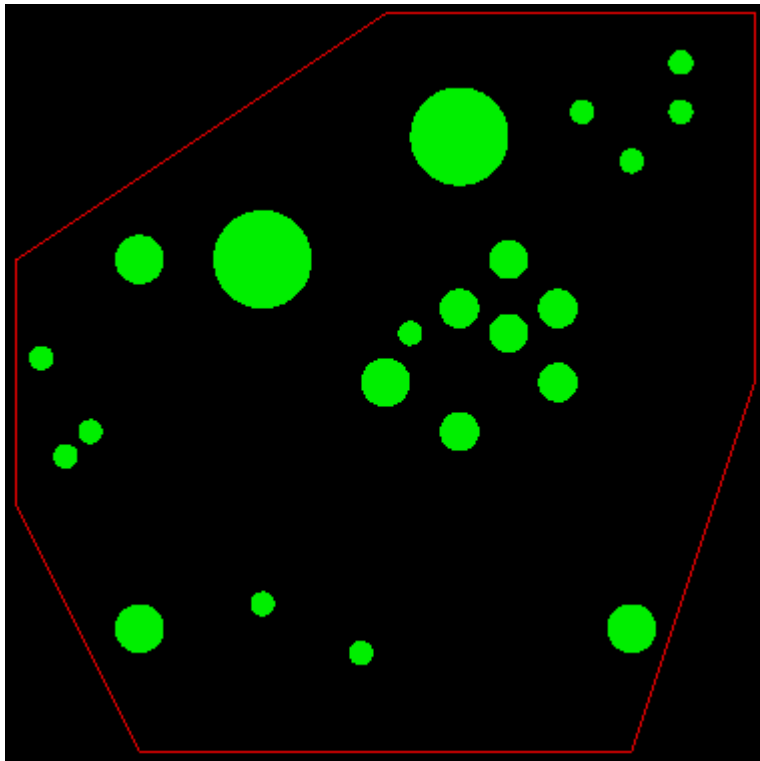
² Brady J., Computer simulation of viscous suspensions, *Chemical Engineering Science* **56**, 2001, 2921-2926.

³ D'Adetta G.A. *et al.*, From solids to granulates – Discrete element simulations of fracture and fragmentation processes in geomaterials, *Lecture Notes in Physics* **568**, 2001, 231-250.

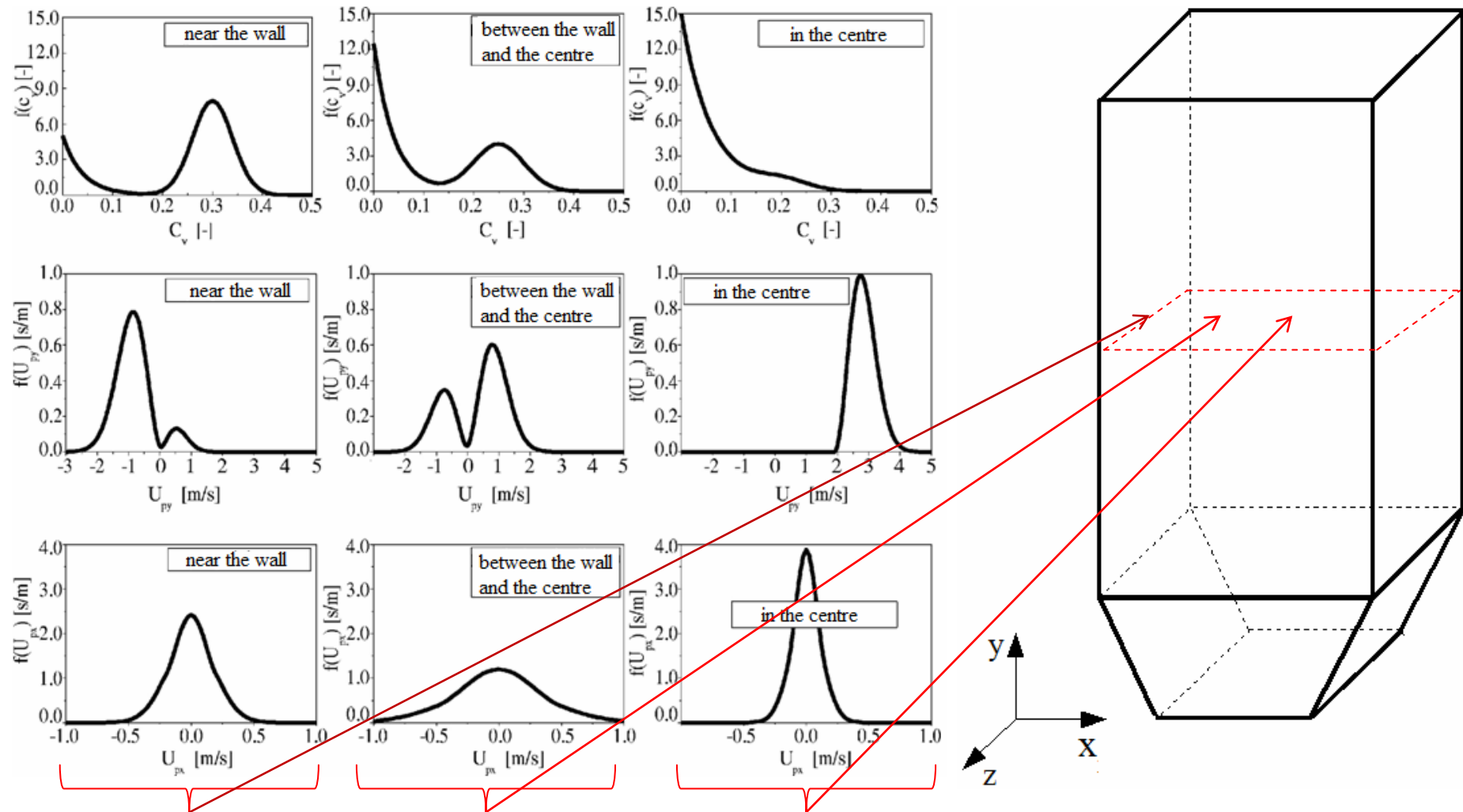
The dynamics of granular material: Particles move individually under gas extortion and they exchange momentum and energy during mutual collisions.

The dynamics of a two-particle collision: We can distinguish three phases of the collision process (impact, contact and the last phase being a result of a collision). One can observe phenomena which occur in the collision process: rebound, static contact, attrition, cohesion and fragmentation. Collisions may occur quickly or slowly in time.

The dynamics of multiparticle collisions: It occurs when the contact times between different pairs of colliding particles are larger than times of their individual motion.



Local structure of a granular material under fluidisation regime¹



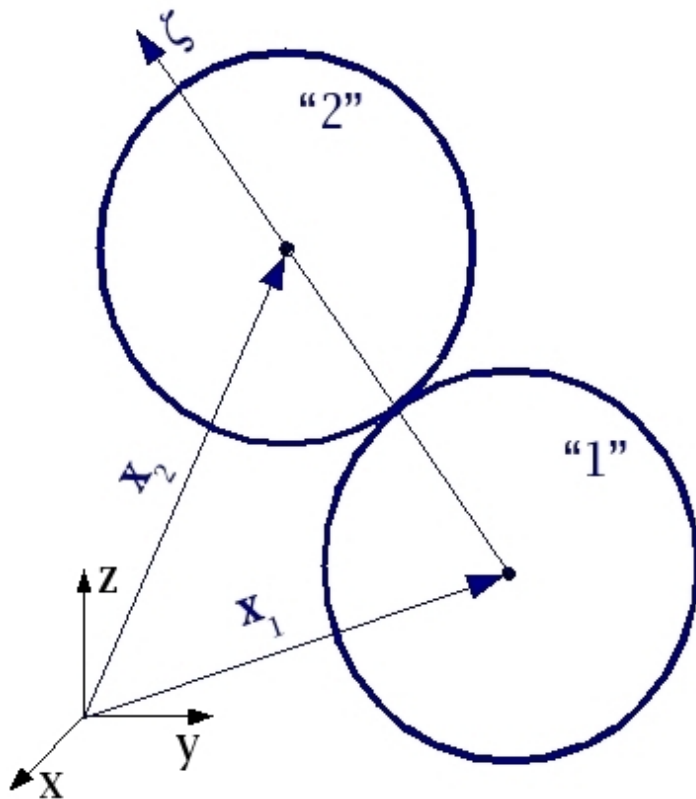
¹ Leszczyński J., Bis Z., Gajewski W., Evolution of structure and particle velocity distribution in circulating fluidized beds, Powder Technolgy **128**, 2002, 22-35.

PART I:

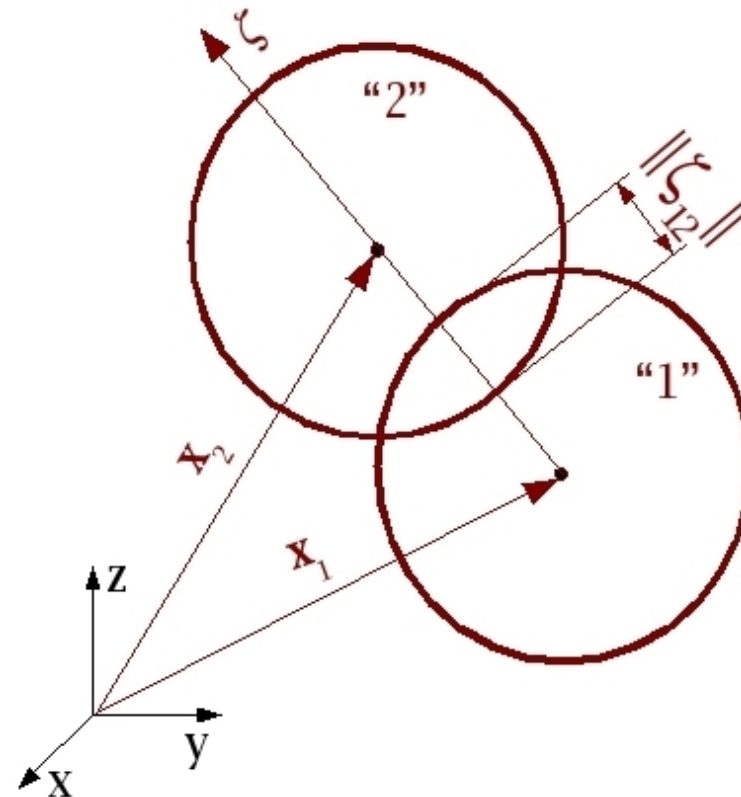
DEM

Modeling of particle collisions – the Discrete Element Method (DEM)

The hard sphere approach¹
(particle contacts without deformation)



The soft sphere approach²
(particle contacts with deformation)



¹ Greenspan D., *Discrete numerical methods in physics and engineering*, Academic Press, New York 1974.

² Cundall P.A., Strack O.D.L., A discrete numerical model for granular assemblies, *Geotechnique* **29**, 1979, 47-65.

Discrete Element Method

Let us consider to a set of spherical particles n_p . We introduce index $k=1, \dots, n_p$, denoting the particle number in the set of particles.

Motion equations of mass center of a particle in the global system of coordinates (x_1, x_2, x_3)

- particle motions without any collision

$$\begin{cases} m_{p_k} \ddot{\mathbf{x}}_{p_k} = \sum_l \mathbf{F}_{p_l} & \mathbf{F}_{p_l} \text{ - long range forces} \\ \mathcal{I}_{p_k} \dot{\boldsymbol{\omega}}_{p_k} = \sum_l \mathbf{M}_{p_l} & \mathbf{M}_{p_l} \text{ - long range torque} \end{cases}$$

- particle motions being in collisions with other particles (wall)

$$\begin{cases} m_{p_k} \ddot{\mathbf{x}}_{p_k} = \sum_{j(k), j(k) \neq k} \left(\mathbf{P}_{j(k)}^{rep} + \mathbf{P}_{j(k)}^{att} \right) + \sum_l \mathbf{F}_{p_l} \\ \mathcal{I}_{p_k} \dot{\boldsymbol{\omega}}_{p_k} = \sum_{j(k), j(k) \neq k} \left(\mathbf{M}_{j(k)}^{rep} + \mathbf{M}_{j(k)}^{att} \right) + \sum_l \mathbf{M}_{p_l} \end{cases}$$

$\mathbf{P}_{j(k)}^{rep}$ - collisional force (repulsive force acting during collision)

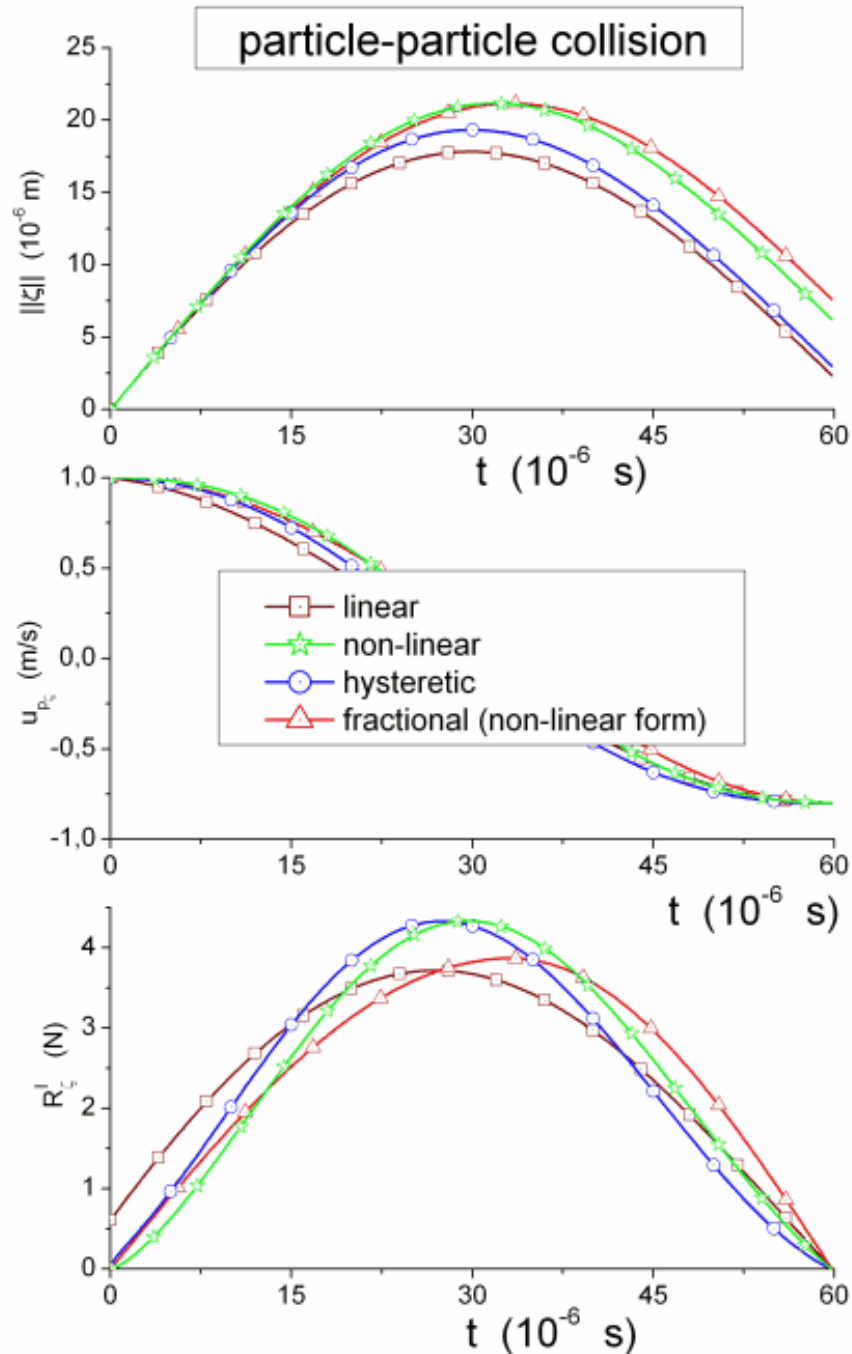
$\mathbf{M}_{j(k)}^{rep}$ - collisional torque (acting during collision)

$\mathbf{P}_{j(k)}^{att}$ - attractive force (i.e. van der Waals force, liquid bridge force, etc.)

$\mathbf{M}_{j(k)}^{att}$ - attractive torque (arise from attractive force)

Comparison model-model

Full characteristics of particle-particle collision for assumed

$$t^{coll}=5,98 \cdot 10^{-5} \text{ s, } e_f=0,8.$$


Granular material: glass	
$\rho_{p1} = \rho_{p2} = 2700 \frac{\text{kg}}{\text{m}^3}; r_{p1} = r_{p2} = 0,0025 \text{ m}; u_{p\zeta}^{imp} = 1 \frac{\text{m}}{\text{s}}$	
Model of the repulsive force	Coefficients
linear	$k = 206221,61 \frac{\text{kg}}{\text{s}^2}; c = 0,608 \frac{\text{kg}}{\text{s}}$
non-linear	$\tilde{k} = 5,028 \cdot 10^7 \frac{\text{kg}}{\text{s}^2 \sqrt{\text{m}}}; \tilde{c} = 191,021 \frac{\text{kg}}{\text{s} \sqrt{\text{m}}}$
hysteretic	$k = 182932,79 \frac{\text{kg}}{\text{s}^2}; k^* = 285832,48 \frac{\text{kg}}{\text{s}^2}$ $\zeta^* = 7,52 \cdot 10^{-6} \text{ m}$
fractional (non-linear form)	$\tilde{k} = 5,028 \cdot 10^7 \frac{\text{kg}}{\text{s}^2 \sqrt{\text{m}}}; \tilde{c} = 416,152 \frac{\text{kg}}{\text{s} \sqrt{\text{m}}}$ $\alpha = 0,103$

Comparison model-model

Measure of impact energy dissipation over the number of particle contacts

$$\varepsilon = 1 - \left(e_r^{eff} \right)^2 = 1 - \left(\frac{\sqrt{\sum_{k=1}^{nc_p} \left(u_{p\zeta_k}^a \right)^2}}{\sqrt{nc_p} |u_{p\zeta}^{imp}|} \right)^2$$

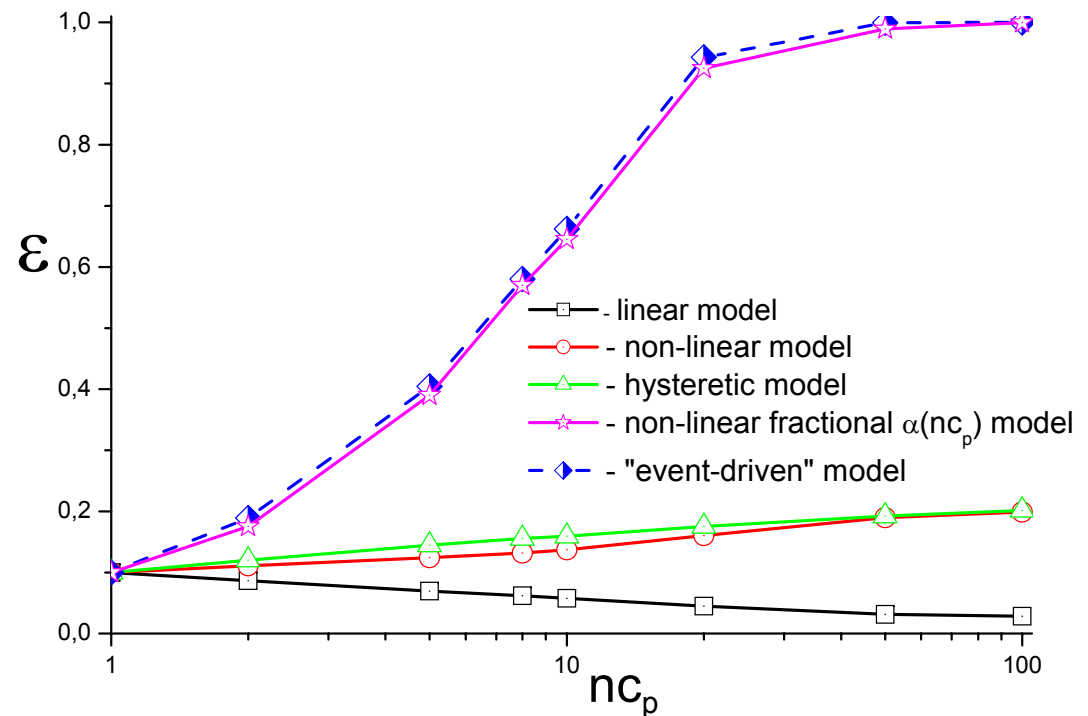
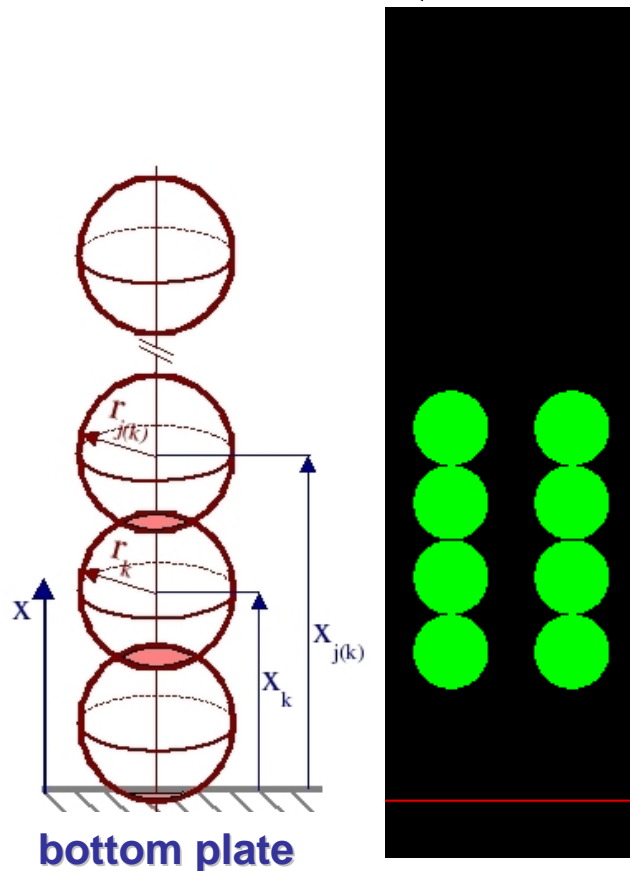
nc_p - number of particle contacts

$u_{p\zeta}^{imp}$ - velocity component of particle impact

$u_{p\zeta}^a$ - velocity component of particle rebound

$r_p = 0,0015 \text{ m}$; $m_p = 1,414 \cdot 10^{-5} \text{ kg}$; $u_{p\zeta}^{imp} = -0,5 \frac{\text{m}}{\text{s}}$

we estimate $\alpha \sim 1 + e^{-nc_p}$ for fractional law



Comparison in global scale

Scheme of a container with notations and the distribution of particle sizes of a granular material used for simulations

COLUMN PARAMETERS

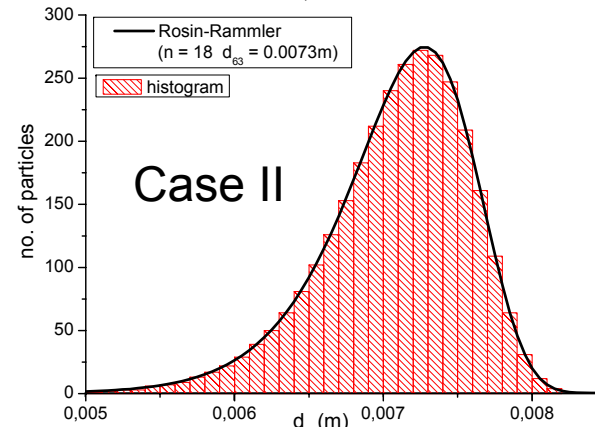
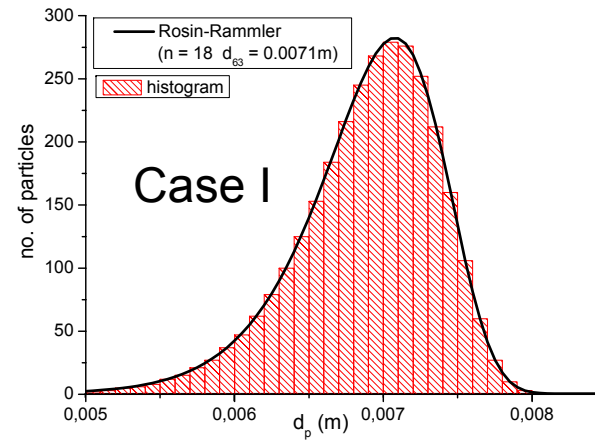
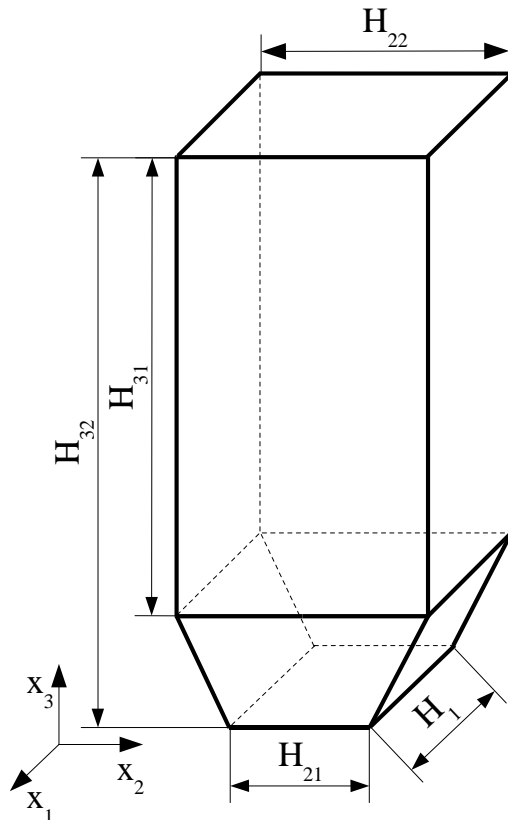
material: plexi ($E = 3 \cdot 10^9$ Pa; $\nu = 0.35$) $H_1 = 0,0425$ m; $H_{21} = 0.0425$ m;
 $H_{22} = H_{12} = 0.073$ m; $H_{31} = 0.299$ m; $H_{32} = 0.399$ m

GAS PARAMETERS

air; $\rho_g = 1.205 \frac{\text{kg}}{\text{m}^3}$; $\mu_g = 1.708 \cdot 10^{-5} \frac{\text{kg}}{\text{s}^2 \text{m}}$; $\bar{u}_{g x_3} = 0.0 \frac{\text{m}}{\text{s}}$

PARAMETERS FOR CALCULATIONS

cell dimensions : $\Delta x_1 = 0,0073$ m; $\Delta x_2 = 0,0073$ m; $\Delta x_3 = 0,00798$ m
time step for calculations : $\Delta t = 2 \cdot 10^{-5}$ s



PARAMETERS OF PARTICLES

granular material: pea

$n_p = \{3000, 4000\}$; $\rho_p = 1300 \frac{\text{kg}}{\text{m}^3}$; $E = 4 \cdot 10^6$ Pa; $\nu = 0.2$

$\mu_{st} = 0.05$; $\mu_{dy} = 0.01$

$\gamma = 0.0725 \frac{\text{J}}{\text{m}^2}$; water content = $\{0, 10, 20\} \%$

Comparison in global scale

Discharging of a container from dry pea particles

3000 dry particles

experiment

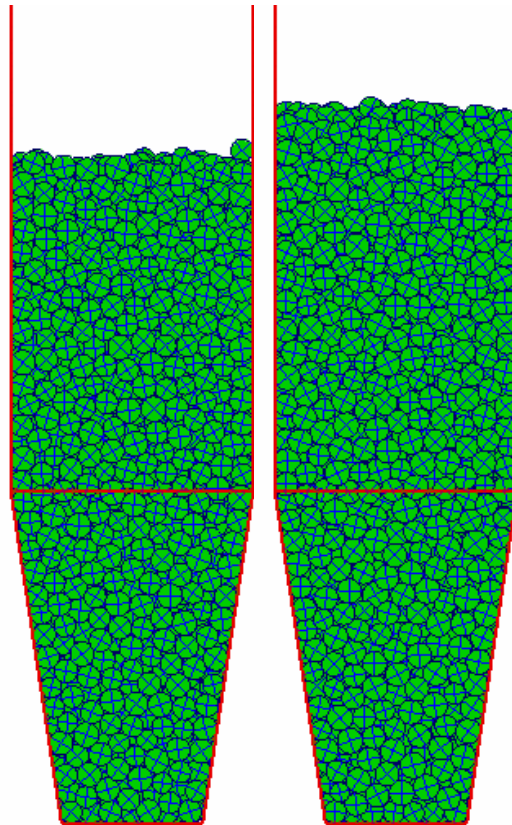
simulations

Case I

Case II

$H_{\text{bed}}=21.0 \text{ cm}$

$H_{\text{bed}}=20.5 \text{ cm}$ $H_{\text{bed}}=21.5 \text{ cm}$



$T_{\text{discharge}}=0.88 \text{ s} \pm 0.04$ $T_{\text{discharge}}=0.77 \text{ s}$ $T_{\text{discharge}}=0.84 \text{ s}$

4000 dry particles

experiment

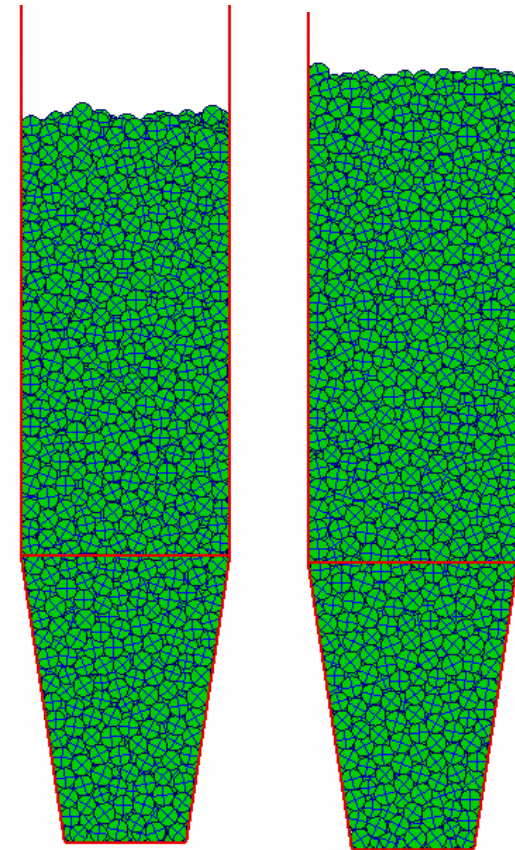
simulations

Case I

Case II

$H_{\text{bed}}=26.8 \text{ cm}$

$H_{\text{bed}}=25.8 \text{ cm}$ $H_{\text{bed}}=27.3 \text{ cm}$



$T_{\text{discharge}}=1.16 \text{ s} \pm 0.04$ $T_{\text{discharge}}=1.01 \text{ s}$ $T_{\text{discharge}}=1.08 \text{ s}$

Comparison in global scale

Discharging of a container from wet pea particles – 3000 particles

3000 wet particles

experiment

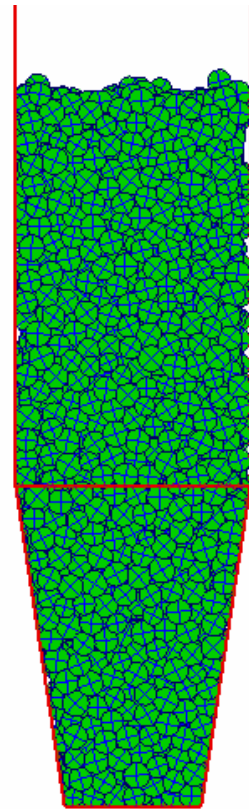
$H_{\text{bed}} = 23.0 \text{ cm}$



$T_{\text{discharge}} = ?$

simulations

$H_{\text{bed}} = 22.5 \text{ cm}$



$T_{\text{discharge}} = ?$

3000 wet particles

experiment

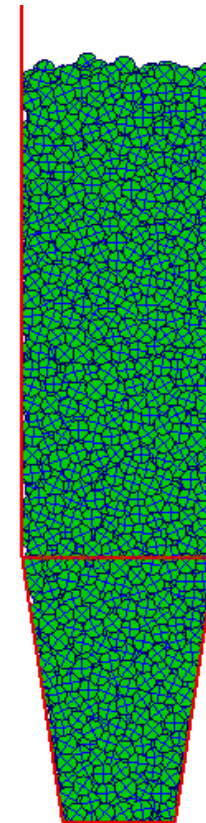
$H_{\text{bed}} = 31.0 \text{ cm}$



$T_{\text{discharge}} = ?$

simulations

$H_{\text{bed}} = 29.2 \text{ cm}$

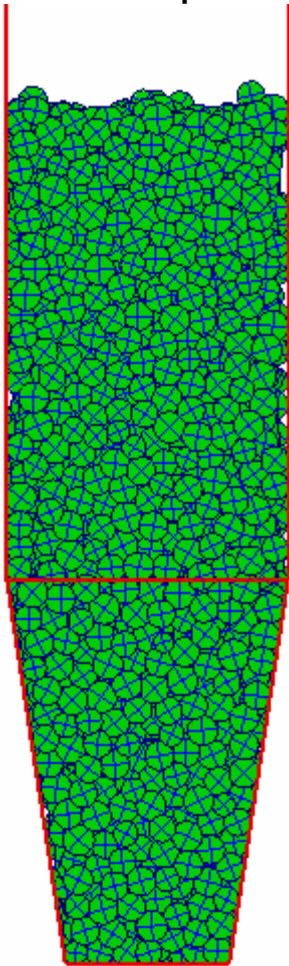


$T_{\text{discharge}} = ?$

An influence of the values of capillary forces for behavior of 3000 pea particles

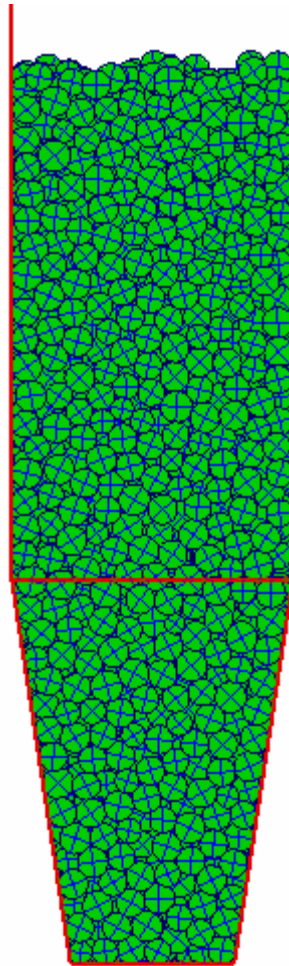
$H_{bed}=22.5$ cm

The same as
in the experiment



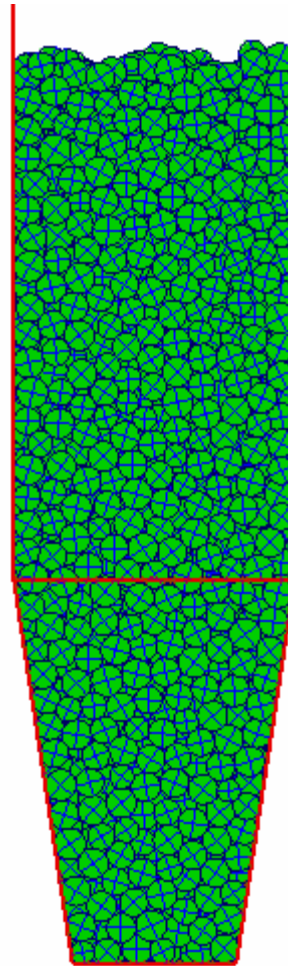
$H_{bed}=23.5$ cm

10 times
smaller



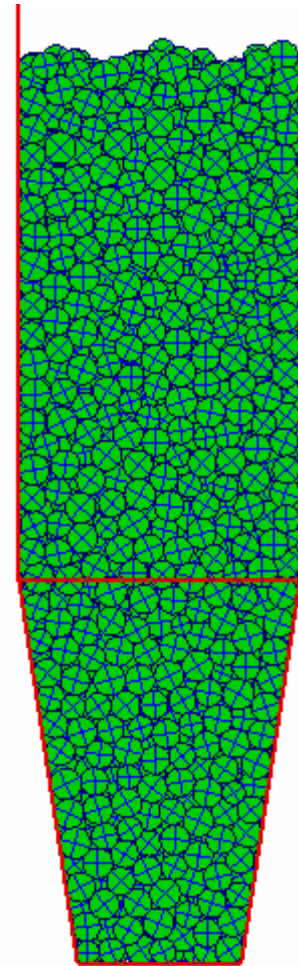
$H_{bed}=23.9$ cm

50 times
smaller



$H_{bed}=24.0$ cm

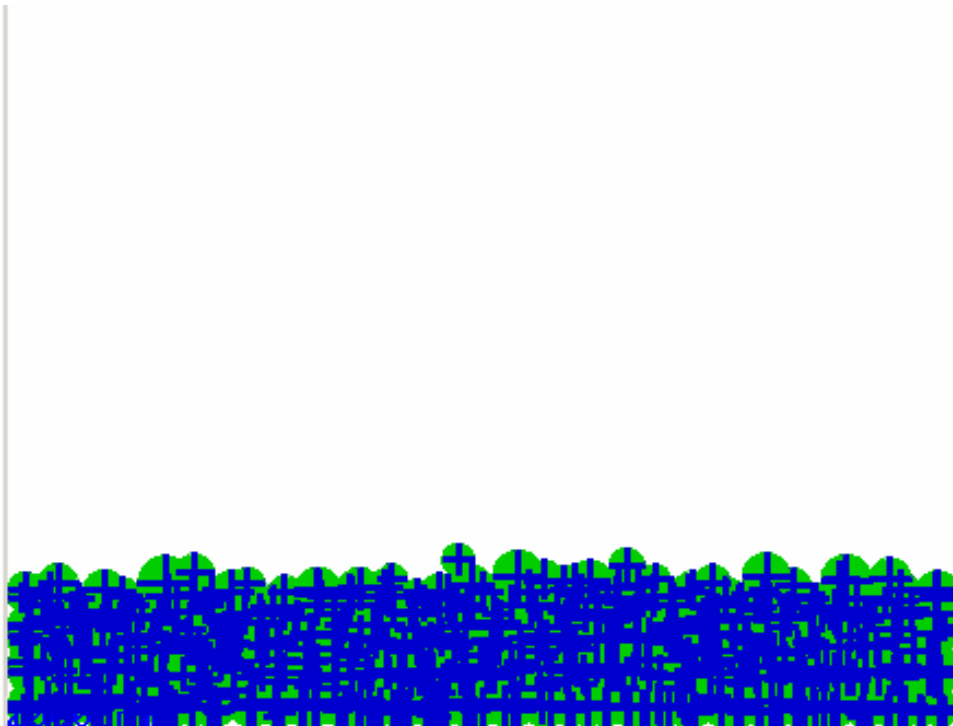
200 times
smaller



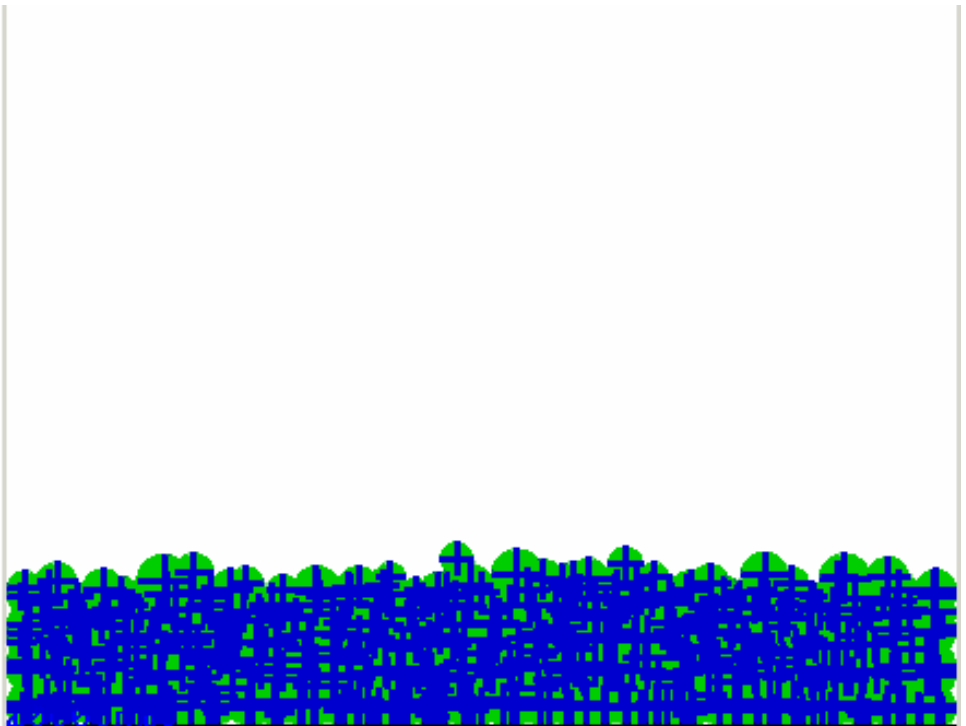
Granular dynamics of 5000 particles

Strong repulsive regime ($\alpha=0,1$)

Without particle frictions: $\mu_{st} = \mu_{dy} = 0$



Particle frictions: $\mu_{st}=0,3$; $\mu_{dy}=0,1$



Particle elutriations from fluidised bed – 200 particles

$$\rho = 2500, E = 5 \cdot 10^9, \nu = 0.28$$

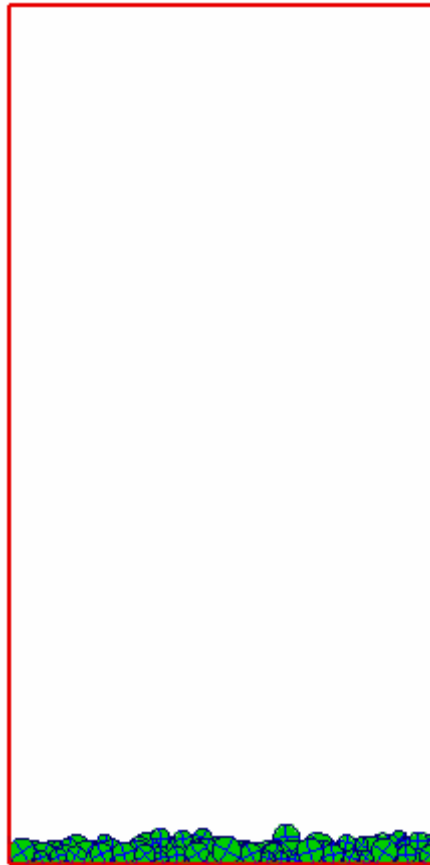
Without cohesion

0 250 500 μ m



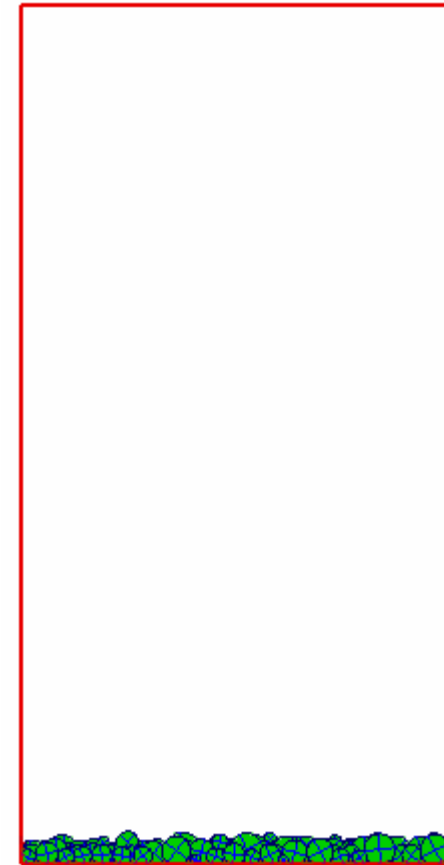
Van der Waals
cohesion

0 250 500 μ m



Van der Waals cohesion
and capillary force

0 250 500 μ m



Mean value of air velocity at the bottom = 4 m/s

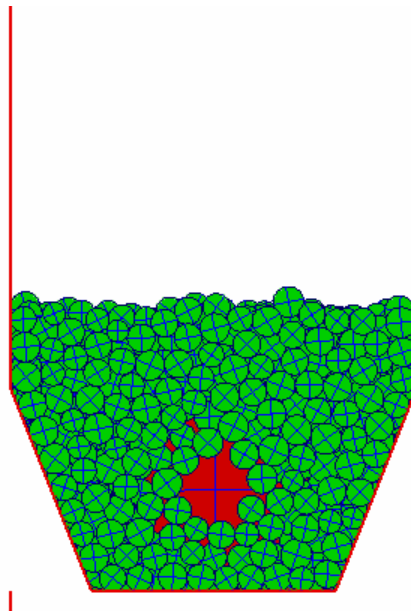
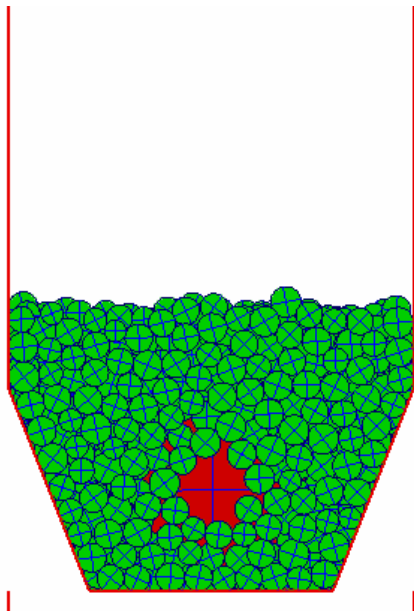
Simulations of „Brazil-nut effect „

without
cohesion

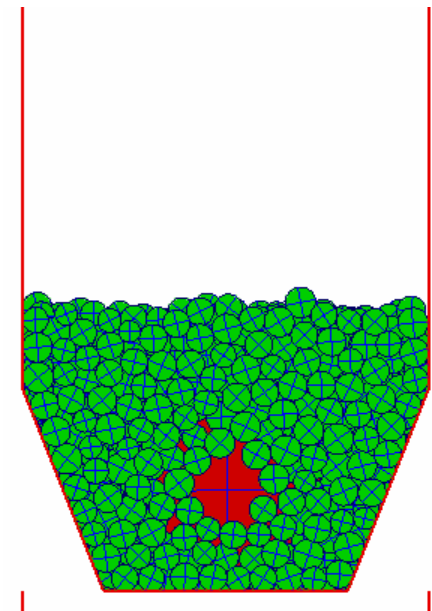
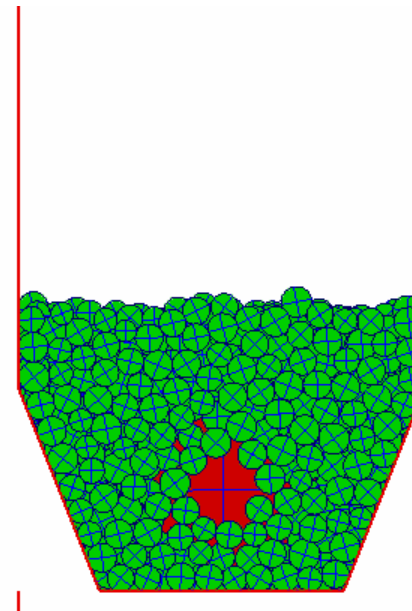
Capillary force -
10% of moisture

without
cohesion

Capillary force -
10% of moisture



$A=3 \cdot 10^{-4} \text{ m}$
 $f=100 \text{ Hz}$



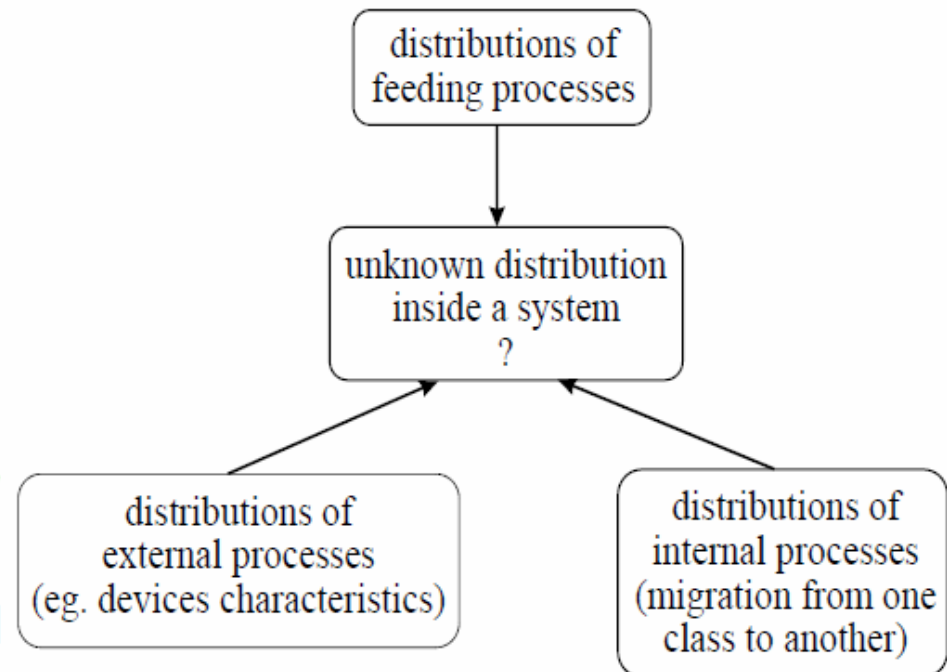
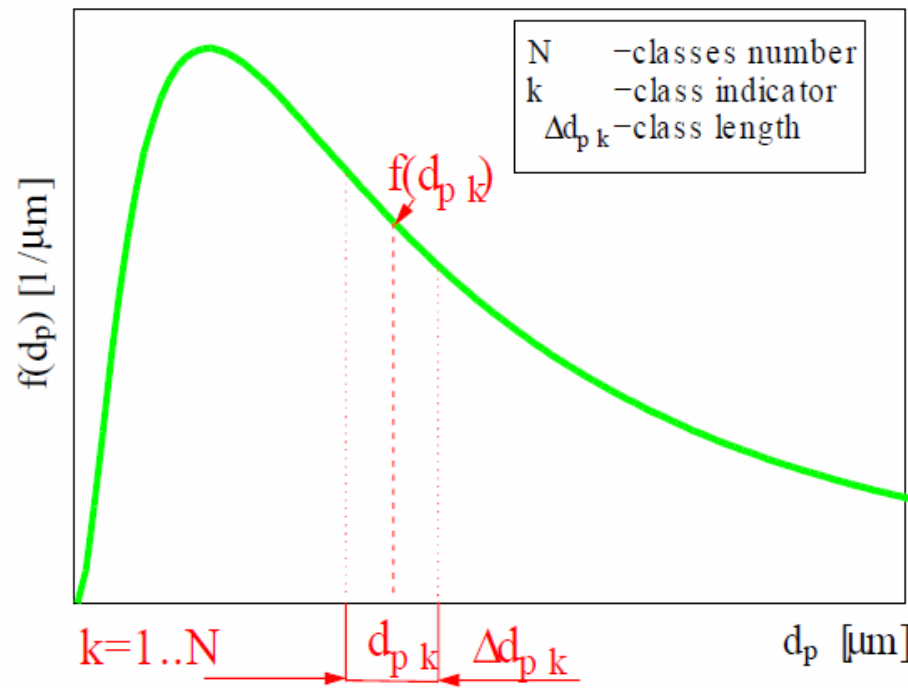
$A=4 \cdot 10^{-4} \text{ m}$
 $f=100 \text{ Hz}$

Hint: cohesion induced by capillary forces decreases „the Brazil-nut effect“

PART II:

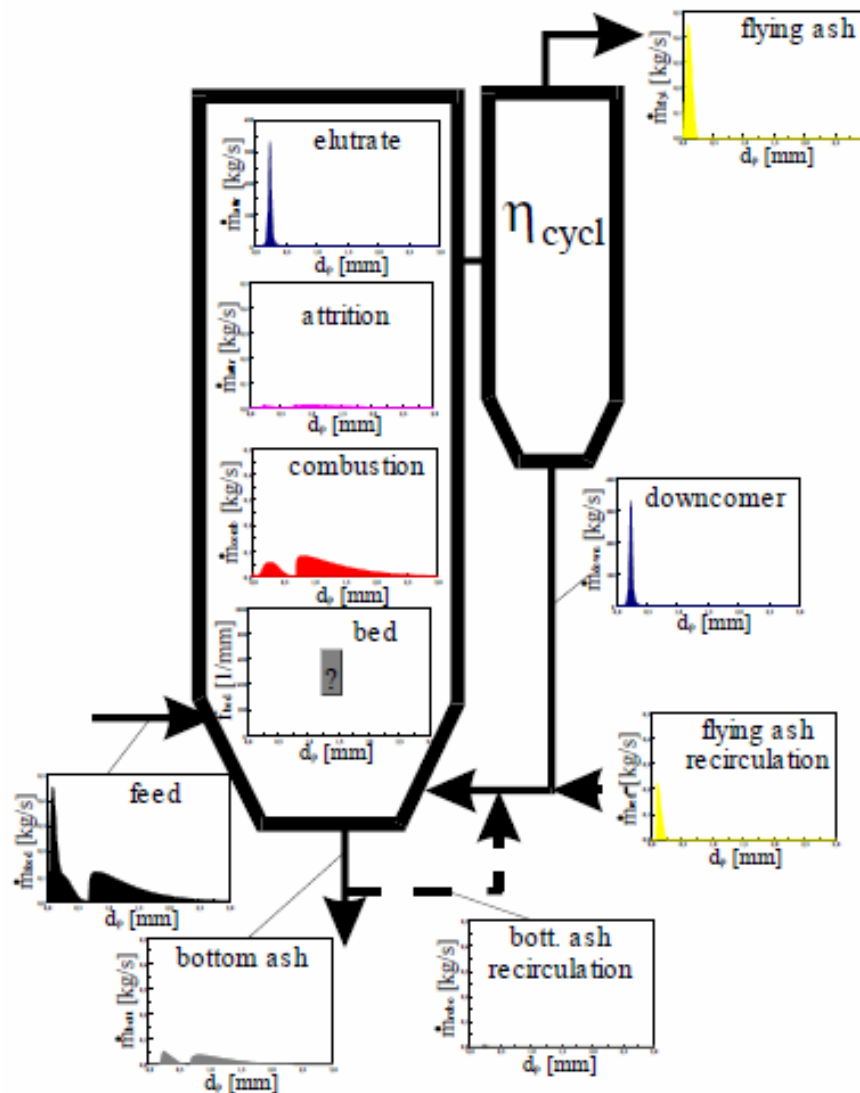
Population balance

General idea of population balance¹

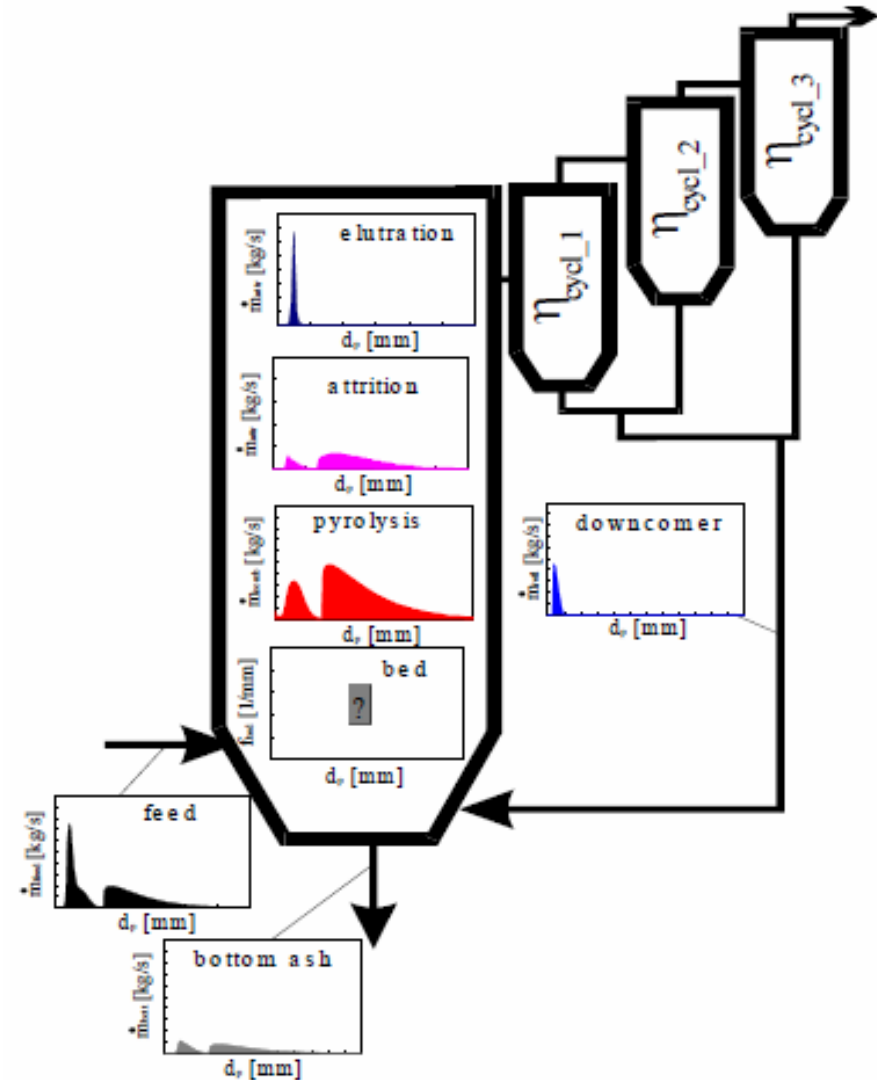


¹ Domański Z., Grzybowski A., Leszczyński J.S., Stationary regime modelling of industrial systems using granular materials, Proc. of the Fifth International Symposium and Exhibition on Environmental Contamination in Central and Eastern Europe, Prague, Czech Republic 2000, 7 pages (CD-ROM)

Topology of a circulating fluidized bed boiler¹



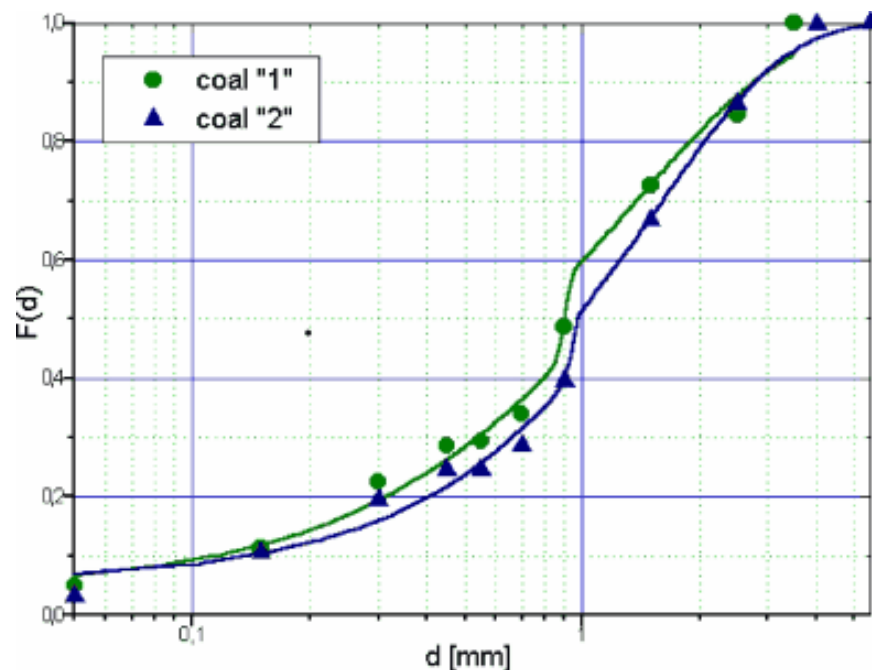
Topology of a circulating fluidized bed gasifier¹



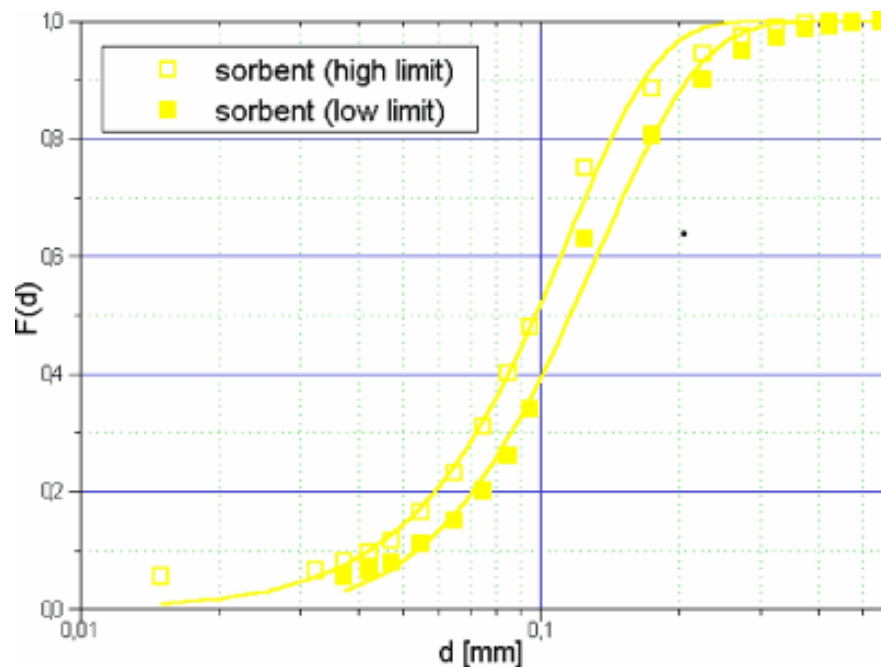
¹ Domański Z., Grzybowski A., Leszczyński J.S., Stationary regime modelling of industrial systems using granular materials, Proc. of the Fifth International Symposium and Exhibition on Environmental Contamination in Central and Eastern Europe, Prague, Czech Republic 2000, 7 pages (CD-ROM)

Granular materials feeding a combustion chamber¹

Coal

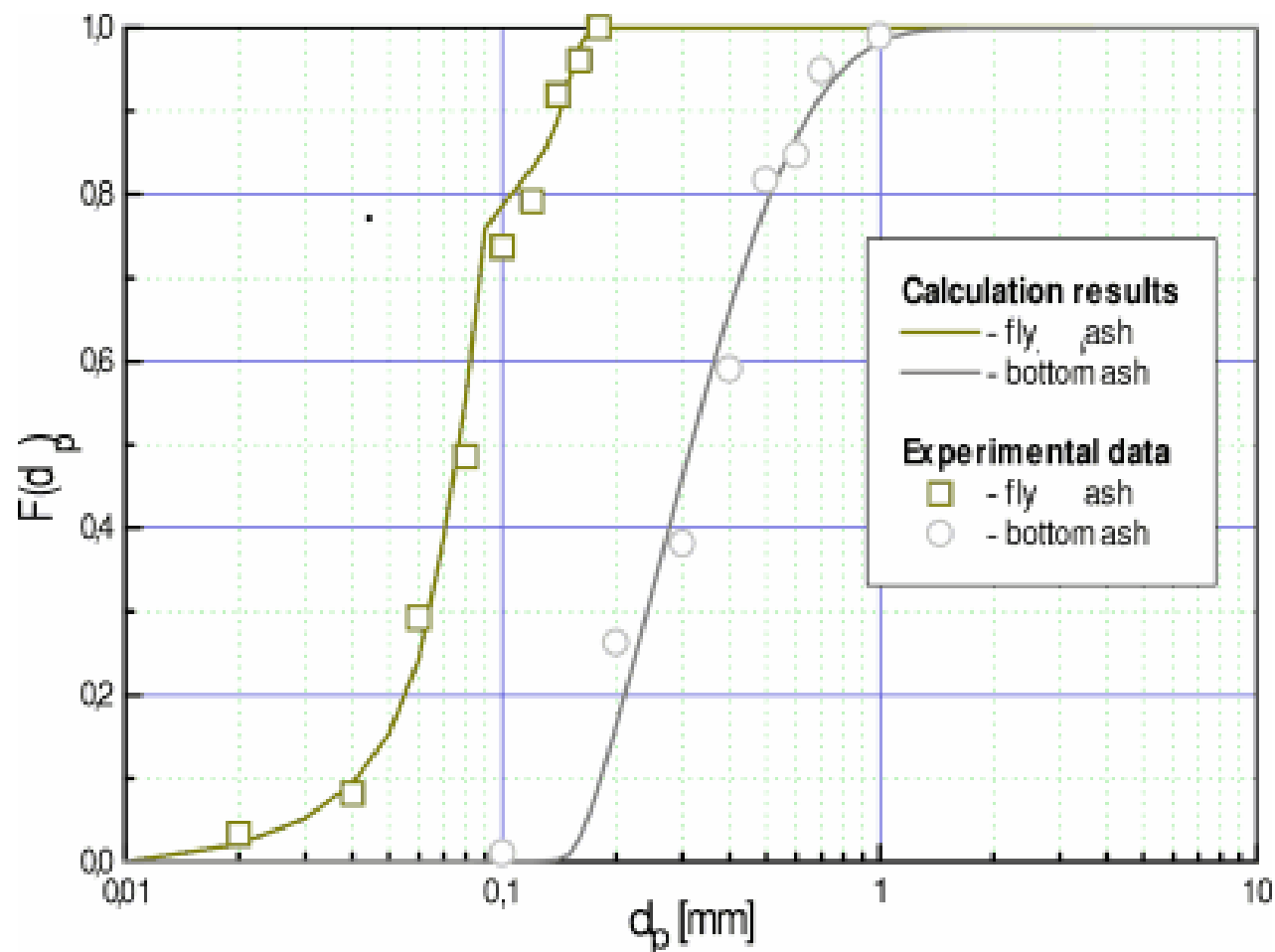


Limestone



¹ Kobylecki R., Horio M., Bis Z., Leszczyński J.S., Nowak W., Analysis and optimization of solid particle distribution in the fluidized bed boiler OFz-450 in Zeran Power Station in Poland, Proceedings of the 4th SCEJ Symposium on Fluidization, Sapporo, Japan 1998, 302-309.

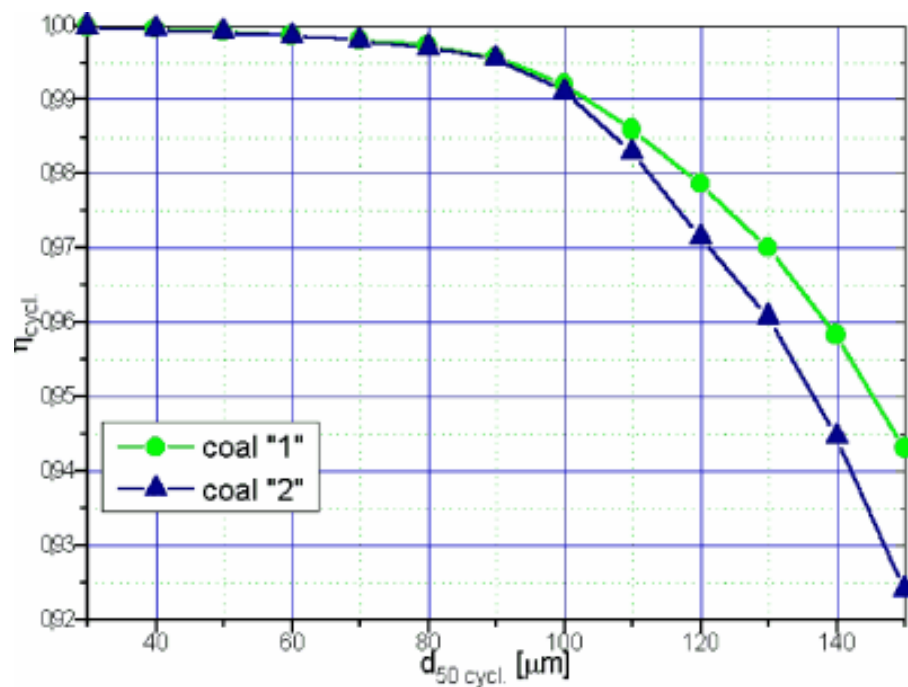
Comparison of cumulative distributions for fly and bottom ashes¹



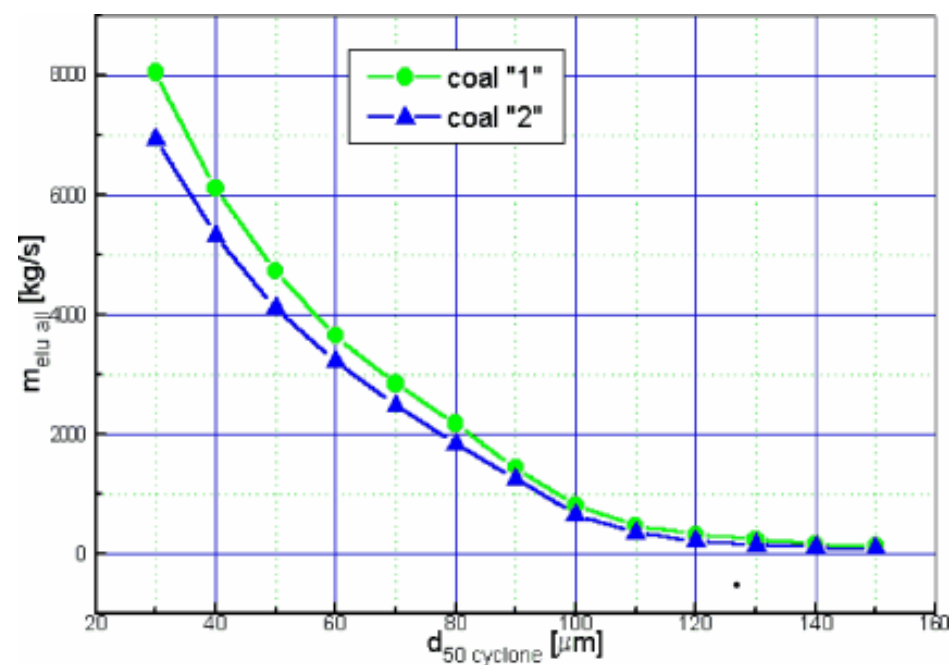
¹ Kobylecki R., Horio M., Bis Z., Leszczyński J.S., Nowak W., Analysis and optimization of solid particle distribution in the fluidized bed boiler OFz-450 in Zeran Power Station in Poland, Proceedings of the 4th SCEJ Symposium on Fluidization, Sapporo, Japan 1998, 302-309.

Some sensibility study of the bolier¹

Cyclone efficiency



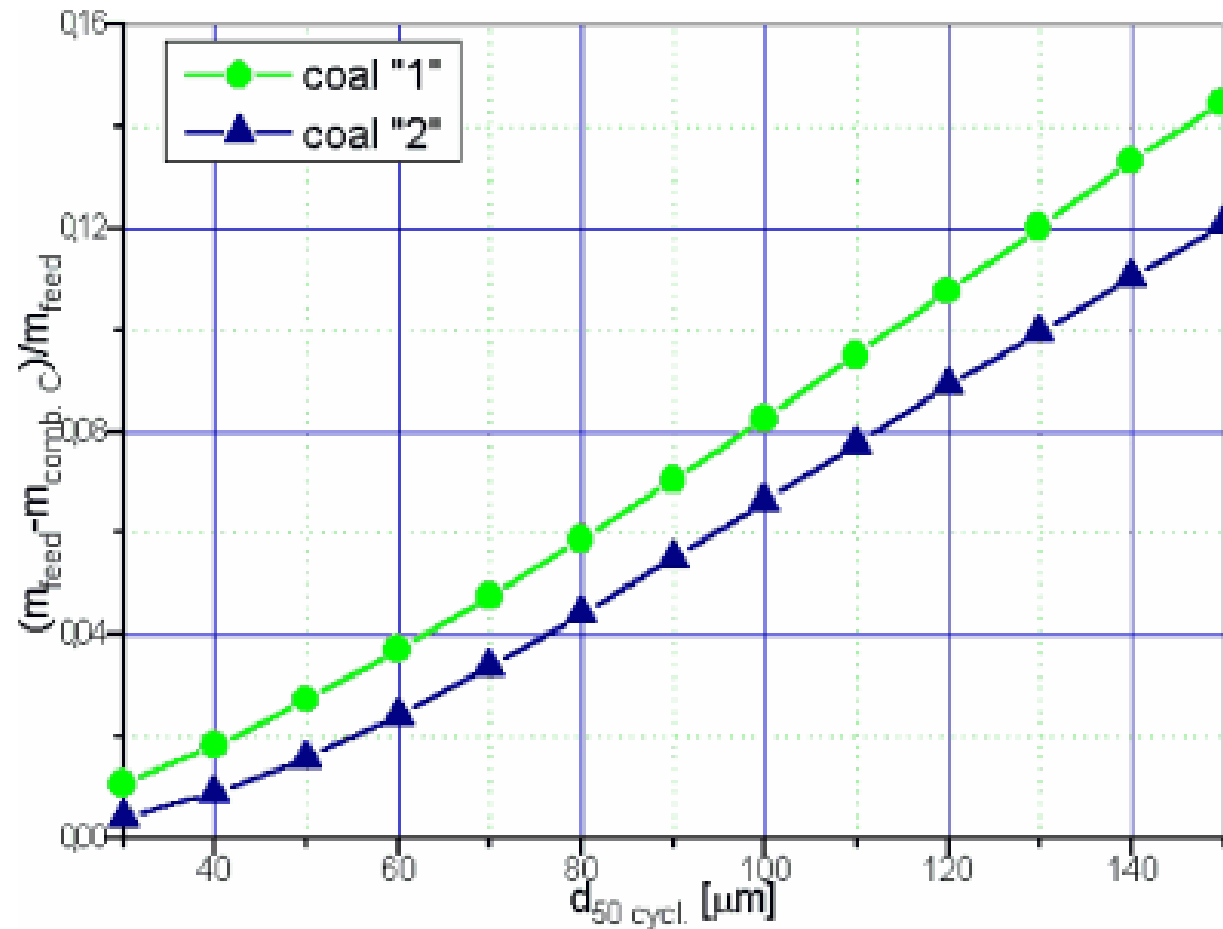
Mass flow elutrated from the bed



¹ Kobylecki R., Horio M., Bis Z., Leszczyński J.S., Nowak W., Analysis and optimization of solid particle distribution in the fluidized bed boiler OFz-450 in Zeran Power Station in Poland, Proceedings of the 4th SCEJ Symposium on Fluidization, Sapporo, Japan 1998, 302-309.

Some sensibility study of the boiler¹

Uncombusted coal particles vs. d_{50} of the cyclone



¹ Kobylecki R., Horio M., Bis Z., Leszczyński J.S., Nowak W., Analysis and optimization of solid particle distribution in the fluidized bed boiler OFz-450 in Zeran Power Station in Poland, Proceedings of the 4th SCEJ Symposium on Fluidization, Sapporo, Japan 1998, 302-309.

PART III:

Fractional calculus

On some evolution of mathematical modeling

1. If our knowledge is limited to the theory of algebraic equations then we would solve only simple problems. We obtained only a simple class of mathematical solutions. **This was the past.**
2. If we know the integro-differential calculus, of course the ordinary order, then we can build mathematical models of many dynamical processes with some degree of their complexity. We obtained a complex class of mathematical solutions where the previous simple class is included. **This is the past and the presents.**
3. If we will extend the integro-differential calculus to fractional one – the calculus where the order of an integral or differential operator is real (complex) then we will model hyper-complex dynamical processes as: multiscale phenomena, processes with memory or history, etc. **In my opinion this is the future.**

Continuous approach – partial fractional differential equations

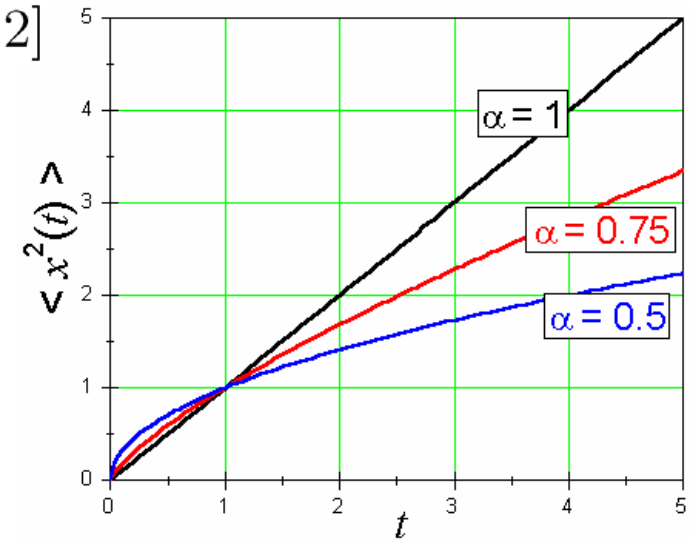
We start from anomalous diffusion¹

Anomalous diffusion is a phenomenon which is strongly observed in complex and non-homogenous systems.

- Classical diffusion $\langle x^2(t) \rangle \sim k_1 t$
- Anomalous diffusion $\langle x^2(t) \rangle \sim k_\gamma t^\gamma \quad \gamma \in (0, 2]$
 - subdiffusion $0 < \gamma < 1$
 - superdiffusion $1 < \gamma < 2$or $\langle x^2(t) \rangle \rightarrow \infty$ Lévy's flights

One observes anomalous diffusion in:

- gas flows inside porous materials
- water diffusion in biological tissues
- molecular dynamics inside some polymer networks
- eddy flows
- ... and many others



¹ R. Metzler, J. Klafter, The random walk's guide to anomalous diffusion: a fractional dynamics approach, Physics Reports **339**, 2000, 1-77.

Continuous approach – partial fractional differential equations

Equations connected with anomalous diffusion¹

- temporal fractional derivative $\beta = (0,2]$

$$\frac{\partial^\beta}{\partial t^\beta} C(x, t) = K_{2,\beta} \frac{\partial^2}{\partial x^2} C(x, t)$$

- spatial fractional derivative $\alpha = (0,2]$

$$\frac{\partial}{\partial t} C(x, t) = K_{\alpha,1} \frac{\partial^\alpha}{\partial |x|_\theta^\alpha} C(x, t)$$

- Generalized anomalous diffusion equation

$$\frac{\partial^\beta}{\partial t^\beta} C(x, t) = K_{\alpha,\beta} \frac{\partial^\alpha}{\partial |x|_\theta^\alpha} C(x, t)$$

$$t \geq 0, \quad x \in \mathbb{R},$$

where $C(x, t)$ is a well-known function (i.e. scalar field of particle concentrations, etc.), $K_{\alpha,\beta}$ is the coefficient of anomalous diffusion [m^α/s^β]

¹ R. Metzler, J. Klafter, The random walk's guide to anomalous diffusion: a fractional dynamics approach, Physics Reports **339**, 2000, 1-77.

Continuous approach – partial fractional differential equations

Mathematical forms of fractional derivatives¹

- temporal fractional derivative defined in the Caputo form (for the function $\phi(t)$)

$$\frac{\partial^\beta}{\partial t^\beta} \phi(t) = {}^C D_t^\beta \phi(t) = \begin{cases} \frac{1}{\Gamma(m-\beta)} \int_0^t \frac{d^m}{d\tau^m} \phi(\tau) (t-\tau)^{\beta-m-1} d\tau & \text{dla } \beta \notin \mathbb{N} \\ \frac{d^m}{dt^m} \phi(t) & \text{dla } \beta \in \mathbb{N} \end{cases}$$

where $m \in \mathbb{N}$, $m-1 < \beta \leq m$

- spatial fractional derivative defined in the Riesz-Feller form (for the function $\phi(x)$)

$$\frac{d^\alpha}{d|x|_\theta^\alpha} \phi(x) = D_\theta^\alpha \phi(x) = \begin{cases} -(c_L(\alpha, \theta) \cdot {}_{-\infty} D_x^\alpha \phi(x) + c_P(\alpha, \theta) \cdot {}_x D_{+\infty}^\alpha \phi(x)) & \text{dla } \alpha \neq 1 \\ -\cos \frac{\theta\pi}{2} \frac{d}{dx} H \phi(x) + \sin \frac{\theta\pi}{2} \frac{d}{dx} \phi(x) & \text{dla } \alpha = 1 \end{cases}$$

where

$$c_L(\alpha, \theta) = \frac{\sin \frac{(\alpha - \theta)\pi}{2}}{\sin(\alpha\pi)}, \quad c_P(\alpha, \theta) = \frac{\sin \frac{(\alpha + \theta)\pi}{2}}{\sin(\alpha\pi)} \quad |\theta| \leq \begin{cases} \alpha, & \text{dla } 0 < \alpha < 1 \\ 2 - \alpha, & \text{dla } 1 < \alpha \leq 2 \end{cases}$$

$$H \phi(x) = \frac{1}{\pi} \int_{-\infty}^{+\infty} \frac{\phi(\xi)}{x - \xi} d\xi$$

¹ Samko S.G., Kilbas A.A., Marichev O.I., *Fractional Integrals and Derivatives. Theory and Applications*, Gordon and Breach, Amsterdam 1993.

Continuous approach – partial fractional differential equations

Comparison of numerical solution with experimental data^{1,2}

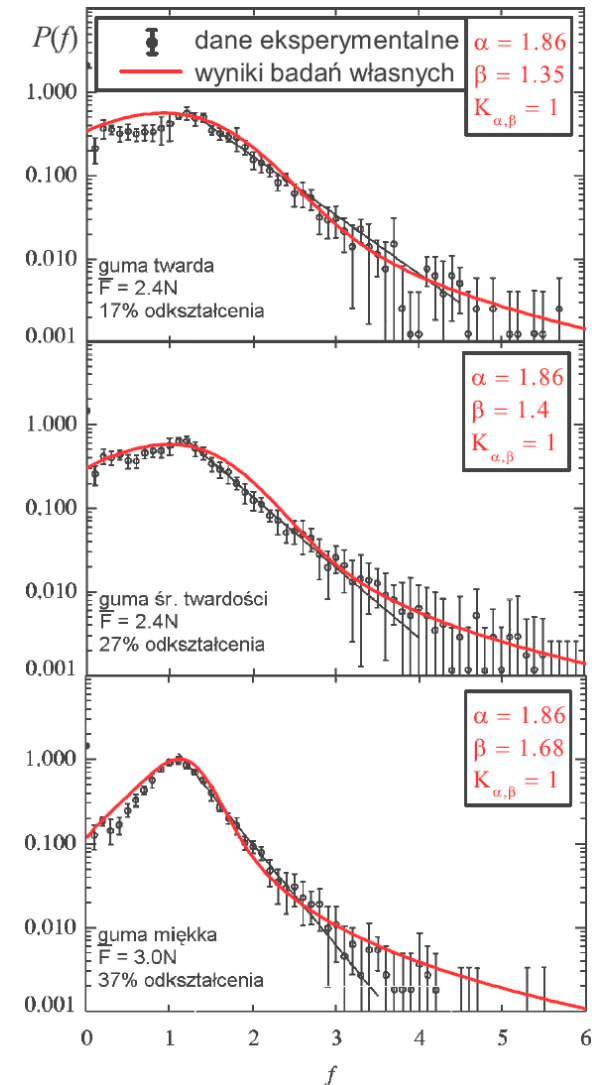
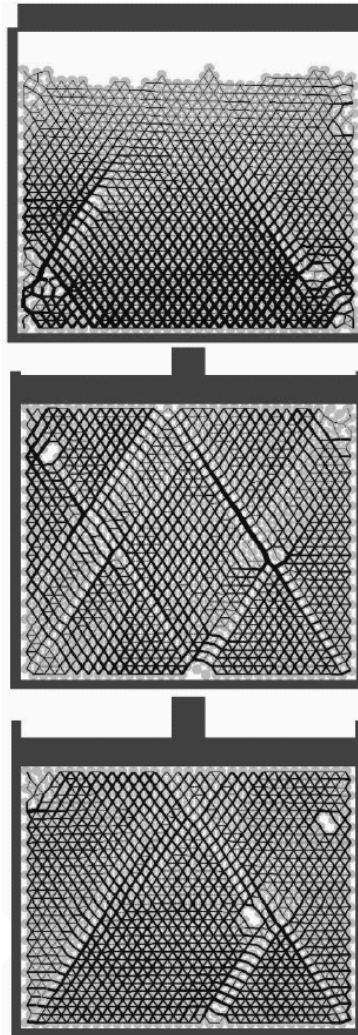
Network of normal forces
in particle-particle contacts
under load

PDF of normalized
inter-particle forces ¹
– right side

$$\frac{\partial^\beta P}{\partial t^\beta} = K_{\alpha,\beta} \frac{\partial^\alpha P}{\partial |f|_\theta^\alpha}$$

$$P(f, 0) = \delta(f)$$

$$f = F/\bar{F}$$



¹ Erikson J.M., Mueggenburg N.W., Jaeger H.M., Nagel S.R., Force distributions in three-dimensional compressible granular pack, Phys. Rev. E **66**, 2002, 040301.

² Ciesielski M., Fractional finite difference method applied for solution of anomalous diffusion equations with initial-boundary conditions, PhD thesis, Czestochowa University of Technology, Czestochowa, 2005.

Continuous approach – partial fractional differential equations

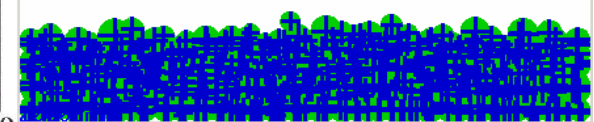
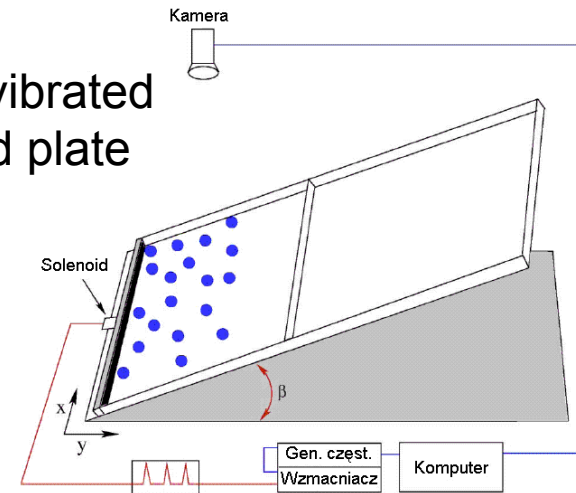
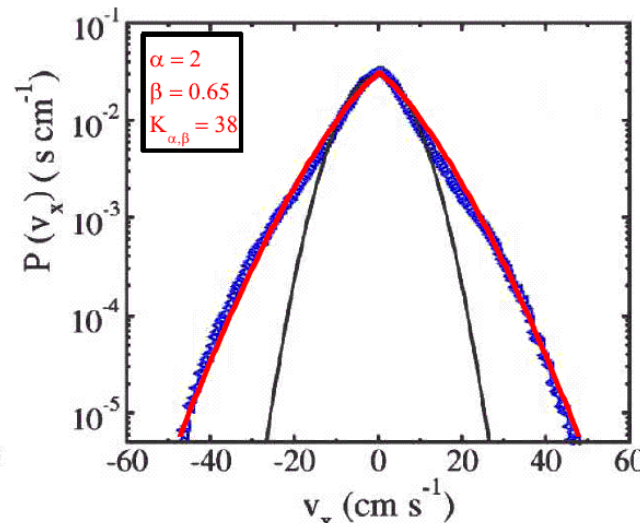
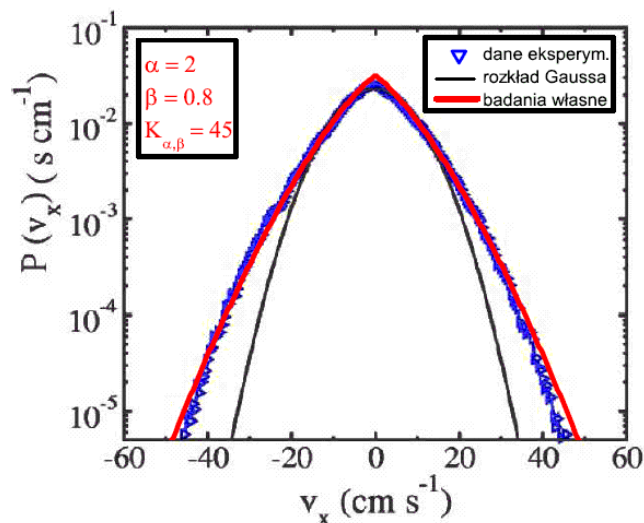
Comparison of numerical solution with experimental data^{1,2}

PDF of particle velocities
registered in cross-section,
according to Blair and Kudrolli ¹

Particles are vibrated
on the inclined plate

$$\frac{\partial^\beta}{\partial t^\beta} P(v_x, t) = K_{2,\beta} \frac{\partial^2}{\partial v_x^2} P(v_x, t)$$

after $t = 1$ s



Hint: ... but the kinetic theory assumes the normal distribution of particle velocities!
Kinetic theory = binary particle collisions, inter-particle frictions are neglected

¹ Blair D.L., Kudrolli A., Collision statistics of driven granular materials, Phys. Rev. E **67**, 2003, 041301.

² Ciesielski M., Fractional finite difference method applied for solution of anomalous diffusion equations with initial-boundary conditions, PhD thesis, Czestochowa University of Technology, Czestochowa, 2005.

Thank you