



# Where Will Our Nanoparticles Go? Numerical Modeling of Nanoparticles Transport

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NanoRem Final Conference  
Nanoremediation for Soil and Groundwater Clean-up  
- Possibilities and Future Trends



Frankfurt am Main, 21<sup>st</sup> November 2016



- Introduction
- Part I: pore scale modelling
- Part II: macro scale modelling
- Part III: examples



# Why numerical modelling?



# Why numerical modelling?



- Where do I inject to be the most effective?
- How many wells and at what distance?
- What injection rate? Injection duration?
- What NP concentration? Stabilizer concentration?
- Where, when and what to monitor to validate NP emplacement?
- Where, when and what to monitor to ensure the safety of relevant receptors?

## → Modelling aims in short:

- Forecast placement of NP during injection
- Forecast long term behaviour / potential transport of particles out of remediation area during and after injection

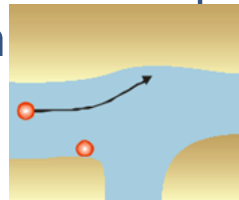
## Main advantages:

- complementing / reducing laboratory testing
- ability to explore different employment options in advance
- guiding design/execution of monitoring
- testing assumptions

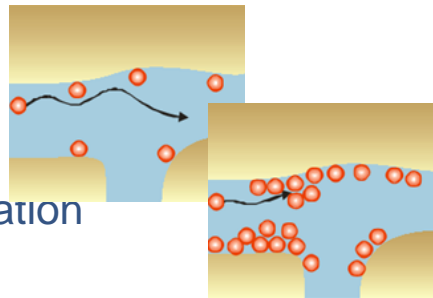
# What affects NP transport?

**And at what scale to be described?**

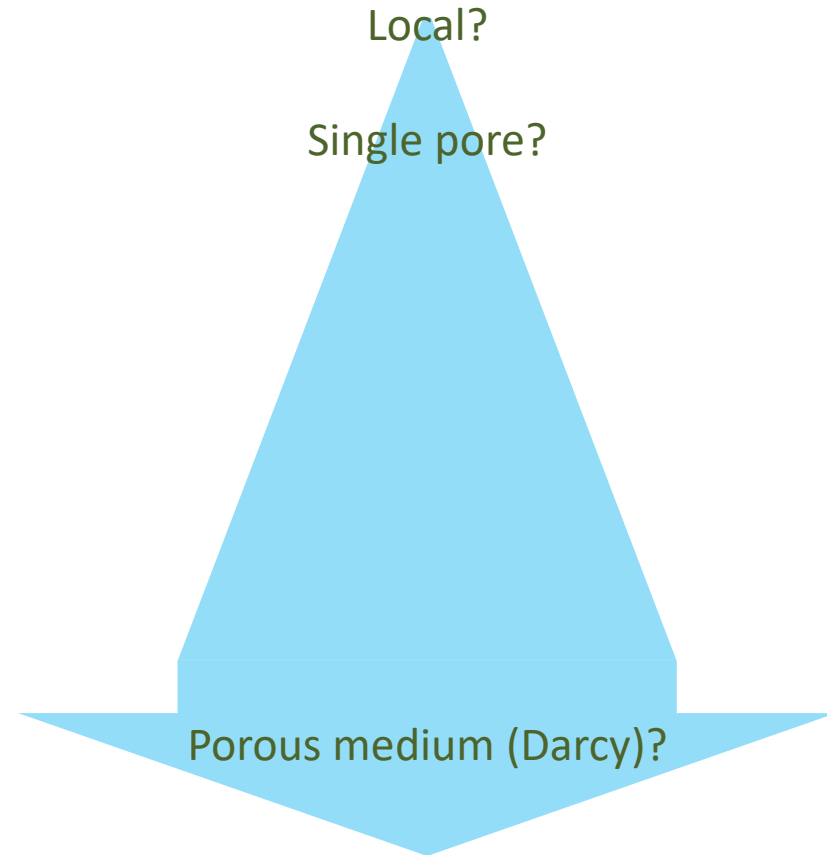
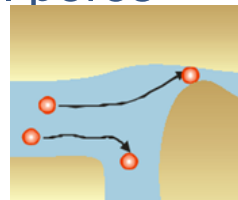
- Fluid flow (NP suspension)
- Interaction with walls of pores of porous medium
  - attachment
  - detachment



- Mutual interaction
  - blocking
  - ripening / aggregation

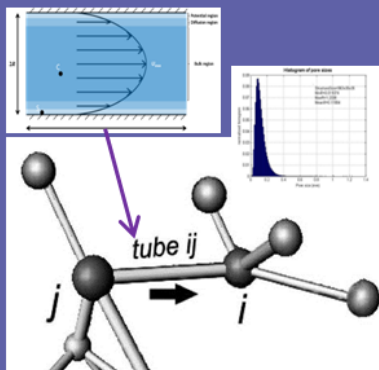


- Interaction with small pores (dead ends)
  - straining / clogging



# NanoRem modelling in a nutshell

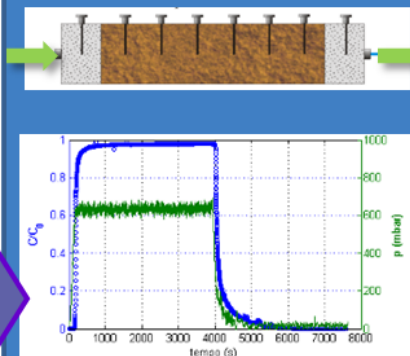
## Pore scale



### NanoPNM and pre- and post-processing tools:

- Monte Carlo approach
- 1<sup>st</sup> principles modelling at pore & pore-network scale to derive upscaled formula with physically based parameters
- validation at scale of small columns

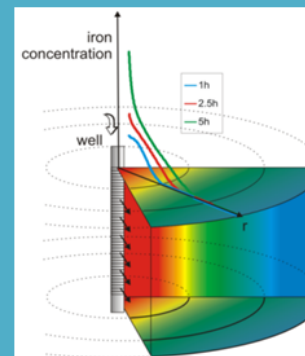
## Laboratory scale



### MNM1D-MNMs: tools for column test interpretation:

- Estimation of DLVO interactions and single collector efficiency
- Solute & colloid transport in 1D columns:
  - Deposition/release
  - Influence of I.S.
  - Clogging
  - Non Newtonian fluid

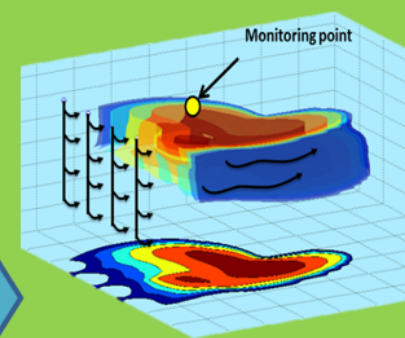
## Pilot-scale



### MNMs: software for simulation of particle injection via single well.

- Solute & colloid transport in radial geometry:
  - Deposition/release
  - Clogging
  - Influence of flow rate
  - Non Newtonian fluid

## Large-scale



### MNM3D: a MODFLOW/RT3D-based simulation tool for particle transport in large scale scenarios:

- Full-scale injection of NPs
- Long-term fate of NPs released in the subsurface
- Features included:
  - Deposition/release
  - Coupled influence of I.S. and flow rate

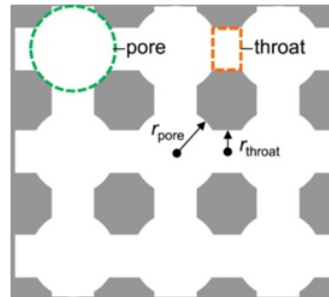
# Part I

## Pore scale modelling

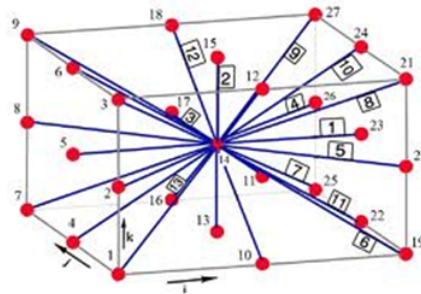


# NanoPNM: a pore network model

represented by:

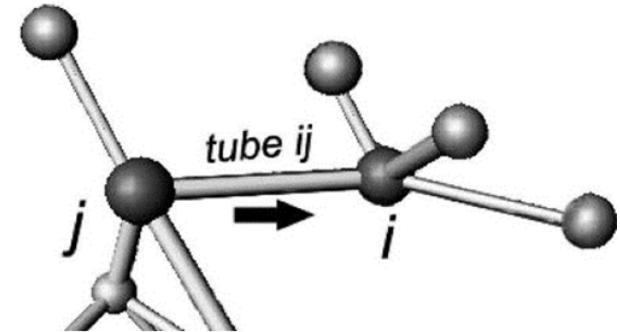


regular network of pores



can be connected to  
26 neighbours (or not)

**Raouf, A., & Hassanizadeh, S. M. (2010).** A new method for generating pore-network models of porous media. *Transport in porous media*, 81(3), 391-407.



define:

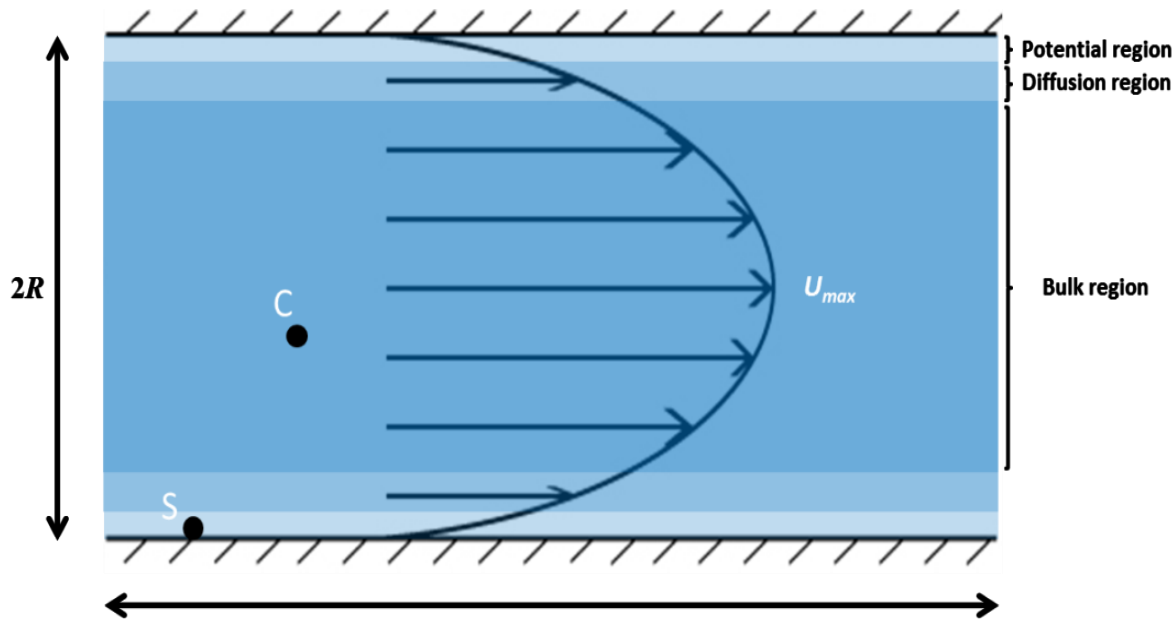
- lattice distance  **$LD$**
- pore/throat size  **$m, s$**
- average # connected neighbours

$$CN = 26(1 - E)$$



“average” sand

# Starting from a single pore throat:



## Hagen-Poiseuille:

$$\bar{U} = \frac{1}{2} U_{max}$$

$$q = \pi R^2 \bar{U} = \frac{\Delta P}{l} \frac{\pi R^4}{8\mu}$$

Seetha, N., Majid Hassanizadeh, S., Kumar, M., & Raof, A. (2015). Correlation equations for average deposition rate coefficients of nanoparticles in a cylindrical pore. *Water Resources Research*, 51(10), 8034-8059.

3D simulation for range of values of pore-scale parameters

Averaging 3D concentrations ( $C$ ,  $S$ ) to obtain 1D concentration field

Fit of 1D concentration field with 1D advection-dispersion-adsorption equation to obtain pore averaged  $k_{att}$  and  $k_{det}$  or  $K_D$

Find general relationship between averaged rate coefficients at pore-scale and various pore-scale parameters

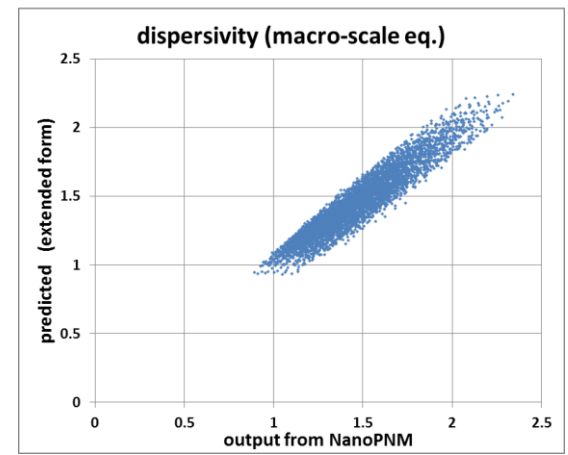
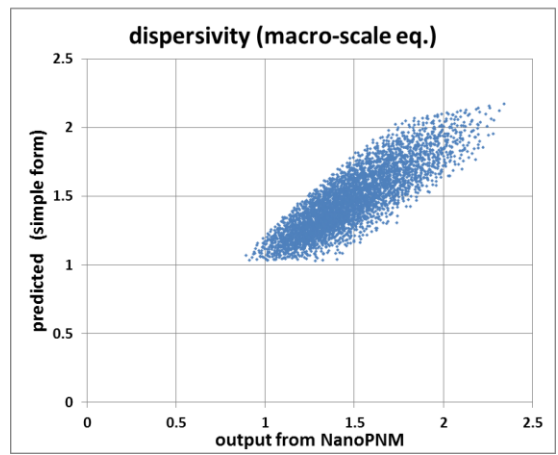
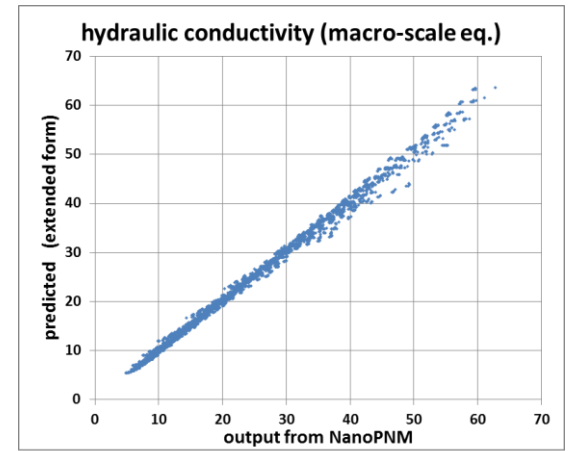
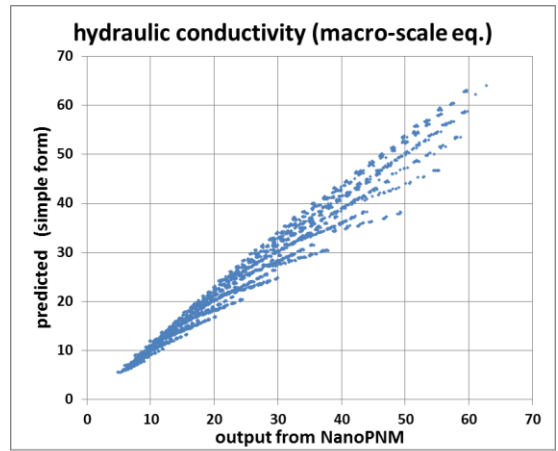
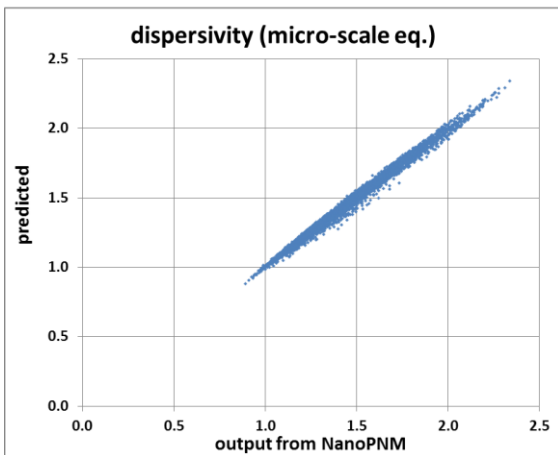
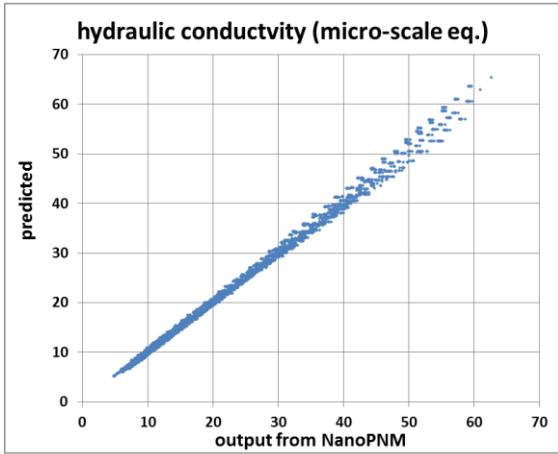
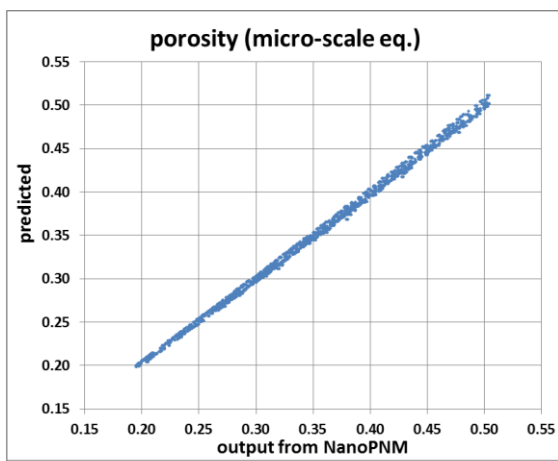
# Multiple pore network simulations for range of parameters

## For tracer flow:

- to obtain relations with input parameters  $LD$ ,  $m$ ,  $s$ , and  $E$  for:
  - porosity  $\phi$
  - hydraulic conductivity  $K$
  - dispersivity  $\alpha$
- that are used to easily find pore network input parameters that represent laboratory experiments
- to derive upscaled relations for  $K$  and  $\alpha$

# Empirical relations for hydraulic parameters


Parameters	Equation	R <sup>2</sup>	RMSQE rel.	RMSQE abs.
NanoPNM input parameters	$\phi = 26.0 \left(\frac{m}{LD}\right)^{1.75} (e^{s/m})^{-0.55} (1 - E)$	0.998	1.1%	0.0035
	$K = 3.04 \cdot 10^6 \left(\frac{m}{LD}\right)^{2.75} m^2 (e^{s/m})^{-2} (1 - E)^{2.25}$	0.997	3.2%	0.84
	$\alpha = 0.243 N_x^{0.1} LD (e^{s/m})^{1.55} (1 - E)^{-0.7}$	0.991	1.6%	0.024
porosity and LD	$K = 650 \phi^{2.5} LD^{1.7}$	0.979	8.2%	2.1
	$\alpha = 0.53 N_x^{0.1} \phi^{-0.5} LD^{0.2}$	0.720	9.3%	0.13
porosity, LD, E	$K = 395 \phi^{2.75} LD^{2.1} (1 - E)^{-0.5}$	0.996	3.7%	0.84
	$\alpha = 0.32 N_x^{0.1} \phi^{-0.25} LD^{0.6} (1 - E)^{-0.5}$	0.885	6.0%	0.085



## Where Will Our Nanoparticles Go?

NanoRem Final Conference, 21<sup>st</sup> November 2016

# Main conclusions (I.1)

- porosity + grain size  hydraulic conductivity, dispersivity
- grain packing cannot be ignored
- Hydraulic conductivity and dispersivity from packed columns may differ between different columns
- and may differ from the actual field values!
- Ideally, laboratory tests should be performed on undisturbed columns
- At least a NP breakthrough test should always be combined with a tracer test for the exact same column

# Multiple pore network simulations for range of parameters

## For NP transport:

- to obtain macro scale relations with pore network flow parameters (providing  $R$  and pore scale  $v$ ) and NP parameters  $a$ ,  $l$ , and  $\psi_{PM}$  &  $\psi_{NP}$  (function of  $l$  &  $pH$ ) for:
  - attachment rate  $K_{att}$
  - detachment rate  $K_{det}$
  - and/or distribution constant  $k_D$

# Empirical relations at single pore scale

## Non-dimensional parameters

	expression	remarks
$\lambda^*$	$\lambda/a$	$\lambda$ = characteristic wavelength of interaction, 100 nm
$A$	$a/R$	interception parameter
$Pe$	$vR/D_\infty$	Peclet number
NDL	$\kappa a$	ratio of particle radius to double layer thickness
$NE1$	$\frac{\pi\epsilon\epsilon_0 a(\psi_{PM}^2 + \psi_{NP}^2)}{k_B T}$	magnitude of surface potentials
$NE2$	$\frac{2(\psi_{PM}/\psi_{NP})}{(1+(\psi_{PM}/\psi_{NP})^2)}$	ratio of surface potentials

$\lambda^*$	1	2	5	10
$N_{E1}$				
1				
5				
10				
20				
40				
100				

Seetha, N., et al. "Correlation equations for average deposition rate coefficients of nanoparticles in a cylindrical pore." *Water Resources Research* 51.10 (2015): 8034-8059.



# Simplified equations

$\lambda^* \times NE1 \geq 40$

$$Da_{att} = 0.158 \lambda^{*1.5} e^{-0.5\lambda^*} A^{0.5} e^{-400A} P e^{-1.1} N_{DL}^{0.5} N_{E1}^{-0.15}$$

$$Da_{det} = 6.40 \lambda^{*0.5} e^{-0.3\lambda^*} A^{-0.1} e^{-400A} P e^{-0.9}$$

$$k'D = 0.0124 \lambda^{*1.0} e^{-0.2\lambda^*} A^{0.6} P e^{-0.2} N_{DL}^{0.5} N_{E1}^{-0.15}$$

$15 < \lambda^* \times NE1 < 40$

$$Da_{att} = 17.8 e^{-1.5\lambda^*} e^{-250A} P e^{-1.0} e^{0.03N_{DL}} e^{-0.25N_{E1}}$$

$$Da_{det} = 1.40 \times 10^{-3} e^{0.5\lambda^*} A^{-0.8} e^{-200A} P e^{-0.9} e^{-0.02N_{DL}} e^{0.03N_{E1}}$$

$$k'D = 6370 e^{-2\lambda^*} A^{0.8} e^{-50A} P e^{-0.1} e^{0.05N_{DL}} e^{-0.28N_{E1}}$$

$\lambda^* \times NE1 \leq 15$

$$Da_{att} = 0.0872 e^{-1.0\lambda^*} A^{-0.5} e^{-120A} P e^{-1.0} N_{DL}^{0.1} e^{-0.1N_{E1}}$$

$$Da_{det} = 2.03 \times 10^{-11} e^{3\lambda^*} A^{-1.3} e^{-120A} P e^{-1.0} N_{DL}^{-0.4} e^{1.0N_{E1}}$$

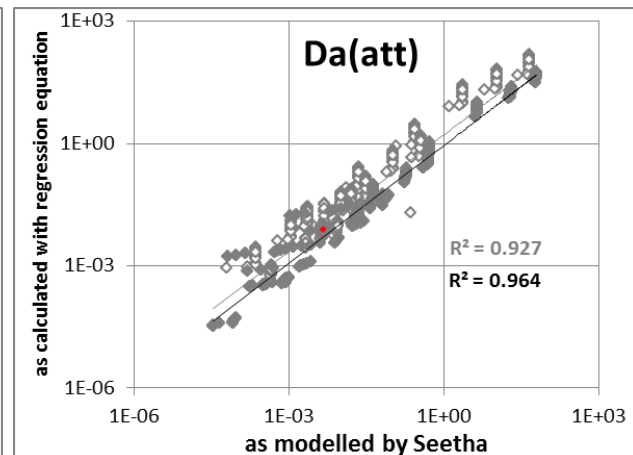
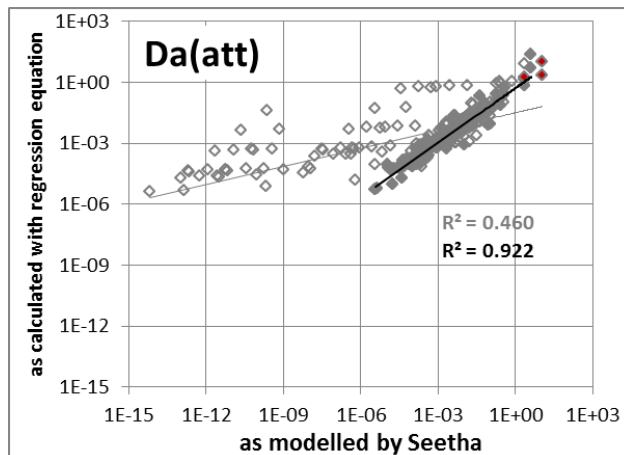
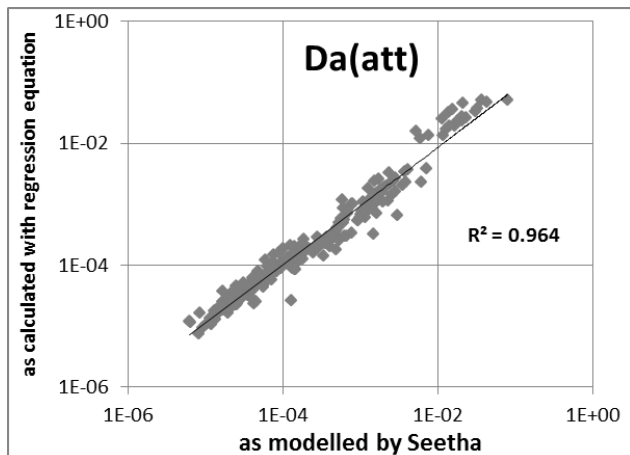
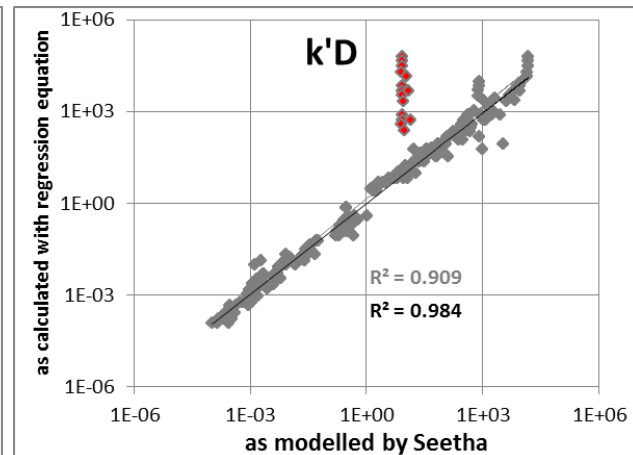
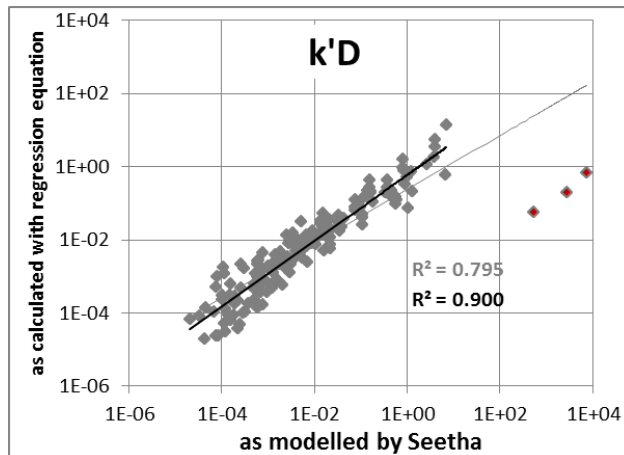
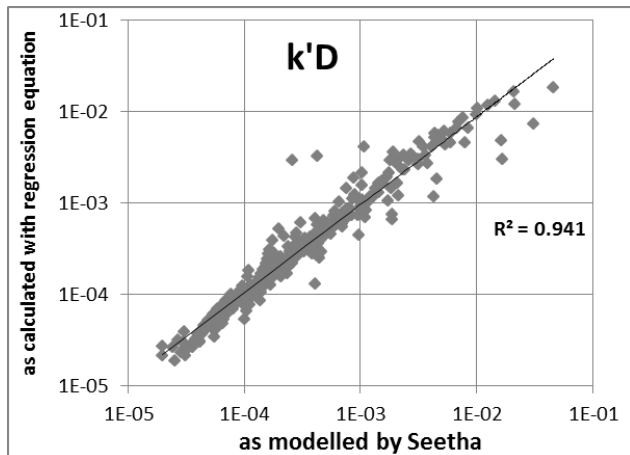
$$k'D = 2.15 \times 10^9 e^{-4\lambda^*} A^{0.8} N_{DL}^{0.5} e^{-1.1N_{E1}}$$

- ◇ all simulation data
- ◆ simulation data resulting in  $k'D$ , outliers for  $Da(det)$  and  $k'D$
- ◆ simulation data resulting in  $k'D$ , used in regression

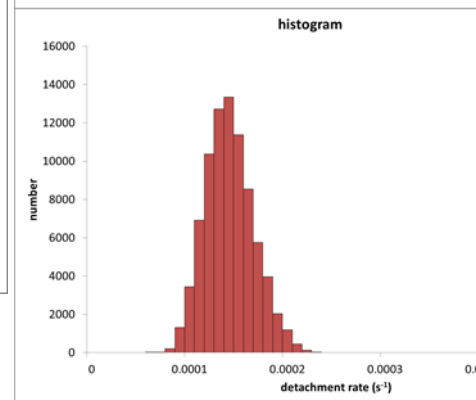
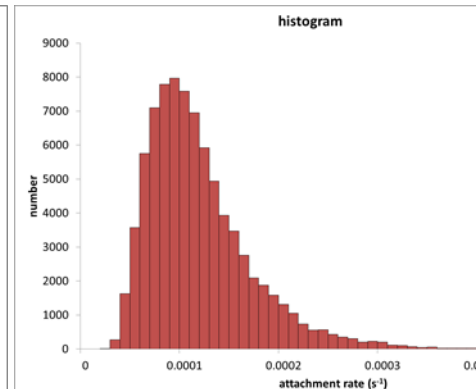
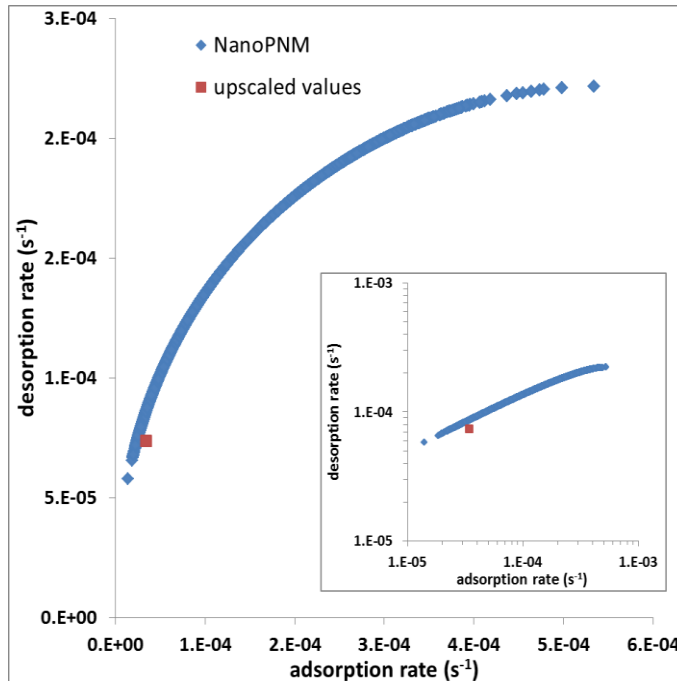
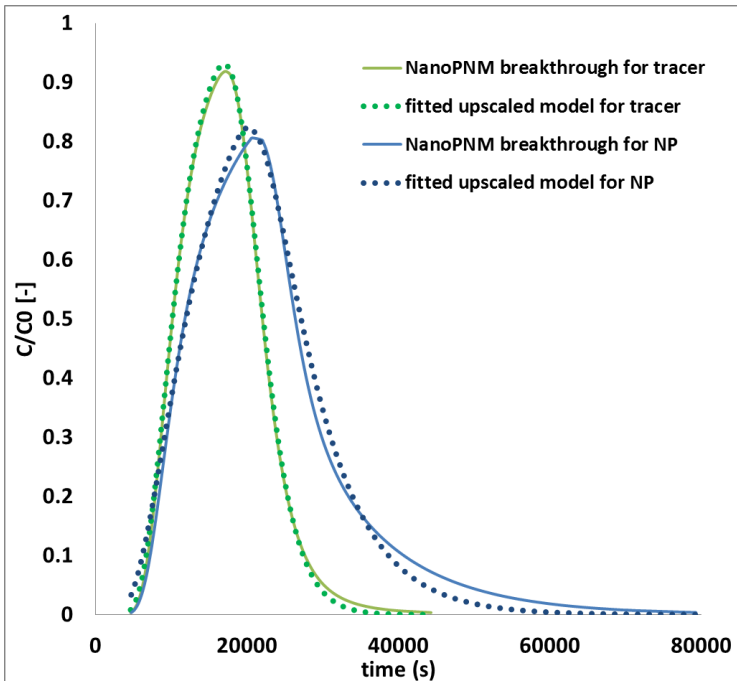
### Large surface charges

### Intermediate range

### Small surface charges



# Some NanoPNM results



# However, .....

- When using the equations in NanoPNM for conditions relevant for Nanoremediation, we predict no significant attachment!
- Attachment only occurs if surface potentials are small
- Even then, attachment rates are small compared to advective process

$N_{E1}$	$\lambda^*$	1	2	5	10
1		Blue	Blue	Blue	Grey
5		Blue	Blue	Grey	Green
10		Blue	Grey	Green	Green
20		Grey	Green	Green	Green
40		Green	Green	Green	Green
100		Green	Green	Green	Green

# Main conclusion (I.2)

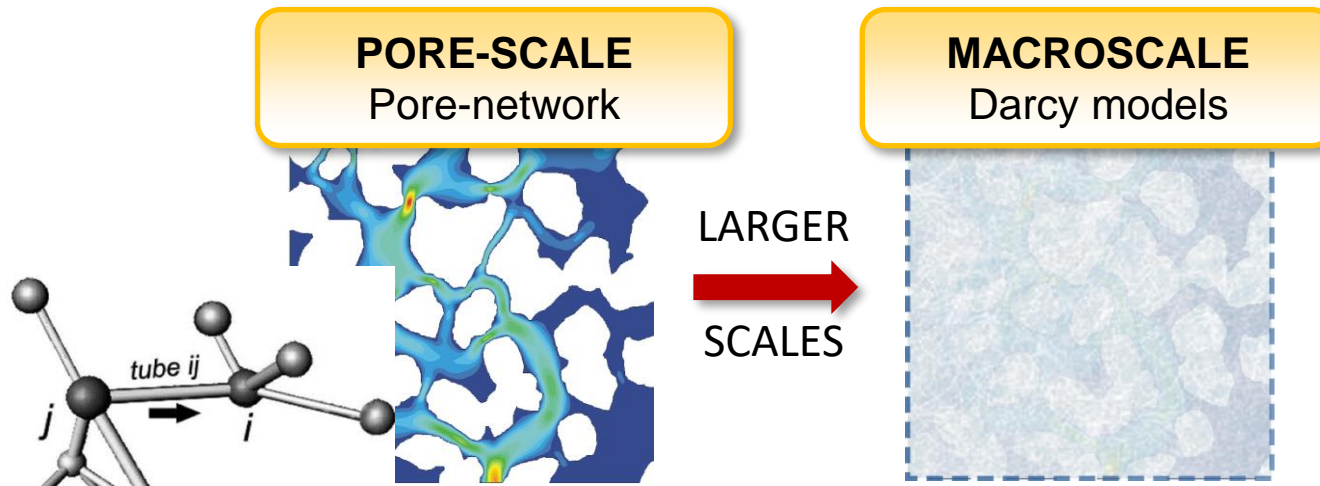
- Upscaling of fundamental description of electrostatic interaction between NP and PM at pore scale does not adequately describe NP attachment and detachment at Darcy scale



# Part II

## Macro scale modelling

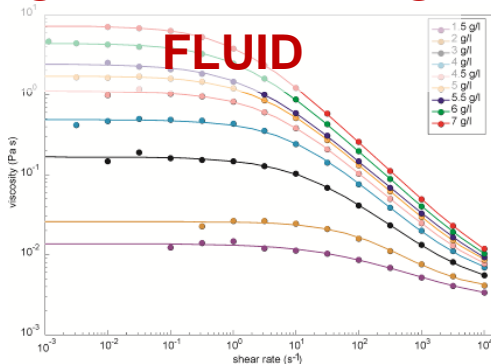
# Macro-scale modeling



- Challenge: NP transport coupled with porous medium clogging and non Newtonian flow of NP slurries → not possible to use “classic” advection-dispersion-deposition models

# Macro-scale modeling

## SHEAR THINNING FLUID



**Darcy's law:**

$$q_m = - \frac{K(s)}{\mu_m \dot{\gamma}_m, c, c_x} \frac{\partial p}{\partial x}$$

**Transport equations:**

$$\frac{\partial}{\partial t} (\epsilon_m c_x) + \frac{\partial}{\partial x} (q_m c_x) - \frac{\partial}{\partial x} \left( \epsilon_m D \frac{\partial c_x}{\partial x} \right) = 0$$

$$\frac{\partial}{\partial t} (\epsilon_m c) + \frac{\partial (\rho_b s_1)}{\partial t} + \frac{\partial (\rho_b s_2)}{\partial t} + \frac{\partial}{\partial x} (q_m c) - \frac{\partial}{\partial x} \left( \epsilon_m D \frac{\partial c}{\partial x} \right) = 0$$

$$\frac{\partial (\rho_b s_1)}{\partial t} = \epsilon_m k_{a,1} c - \rho_b k_{d,1} s_1$$

$$\frac{\partial (\rho_b s_2)}{\partial t} = \epsilon_m k_{a,2} (1 + A_2 s^{\beta_2}) c$$

**Porosity:**

$$\epsilon_m(s) = n - \frac{\rho_b}{\rho_s} s$$

**Fluid viscosity:**

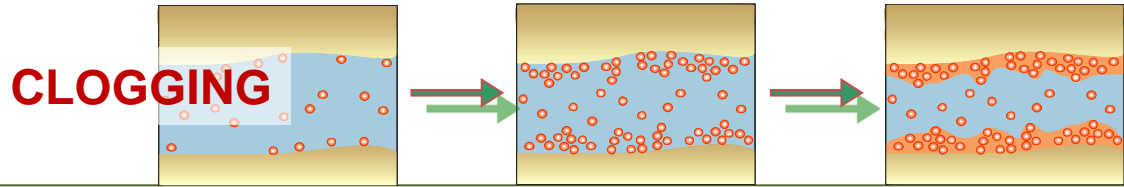
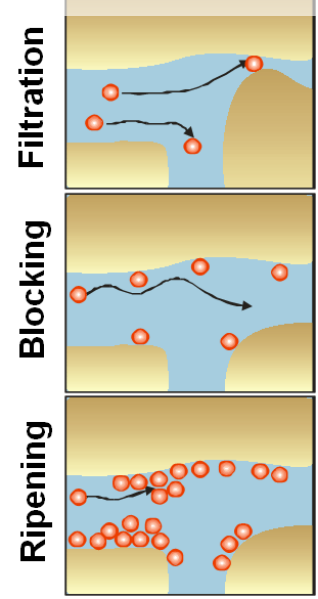
$$\mu_m(\dot{\gamma}_m, c, c_x) = \mu_{m,\infty} + \frac{\mu_{m,0}(c, c_x) - \mu_{m,\infty}}{1 + [\lambda_m(c) \cdot \dot{\gamma}_m]^{\alpha_m c}}$$

$$\dot{\gamma}_m = \alpha_y \frac{q_m}{K(s) \epsilon_m(s)}$$

**Permeability:**

$$K(s) = \left[ \frac{\epsilon_m(s)}{n} \right]^3 \left( \frac{A_0}{A_0 + \theta A_c \frac{\rho_b}{\rho_c} s} \right)^2 K_0$$

## PARTICLE DEPOSITION

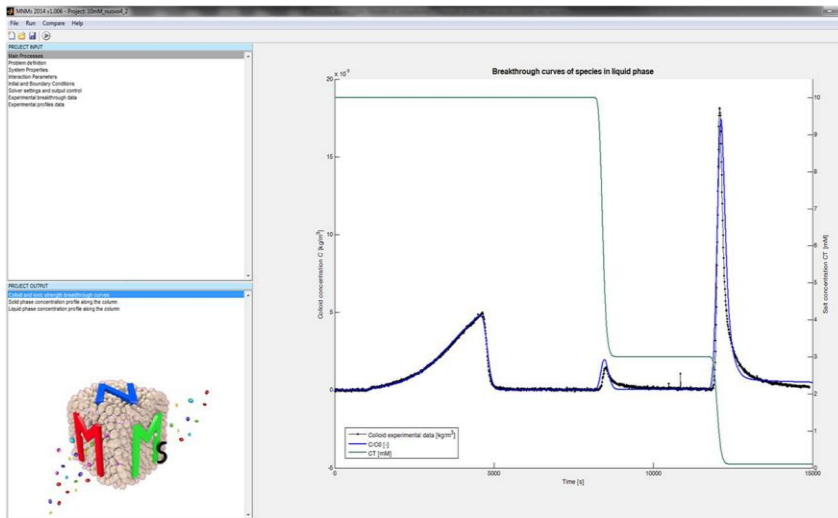
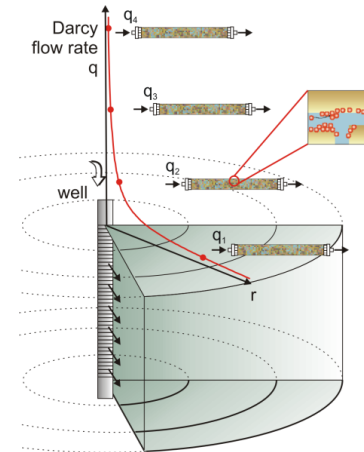


## CLOGGING



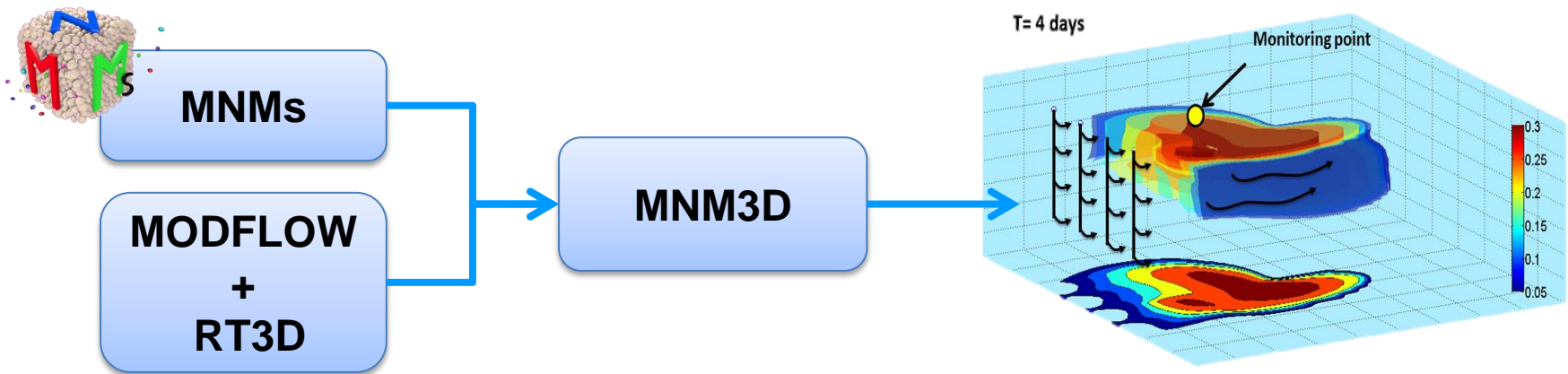
# Modeling tools: MNMs

- Graphical interface for
  - lab-scale transport problems
  - Pilot scale preliminary design
- User-friendly input/output
- Available on Polito's website



# Modeling tools: MNM3D

- Particle transport equations implemented in MNM3D:
  - Modified advection-dispersion equation
  - Ionic strength dependency
  - Flow velocity dependency
 } Coupled solution
- Modeling tool available in the next release of Visual Modflow



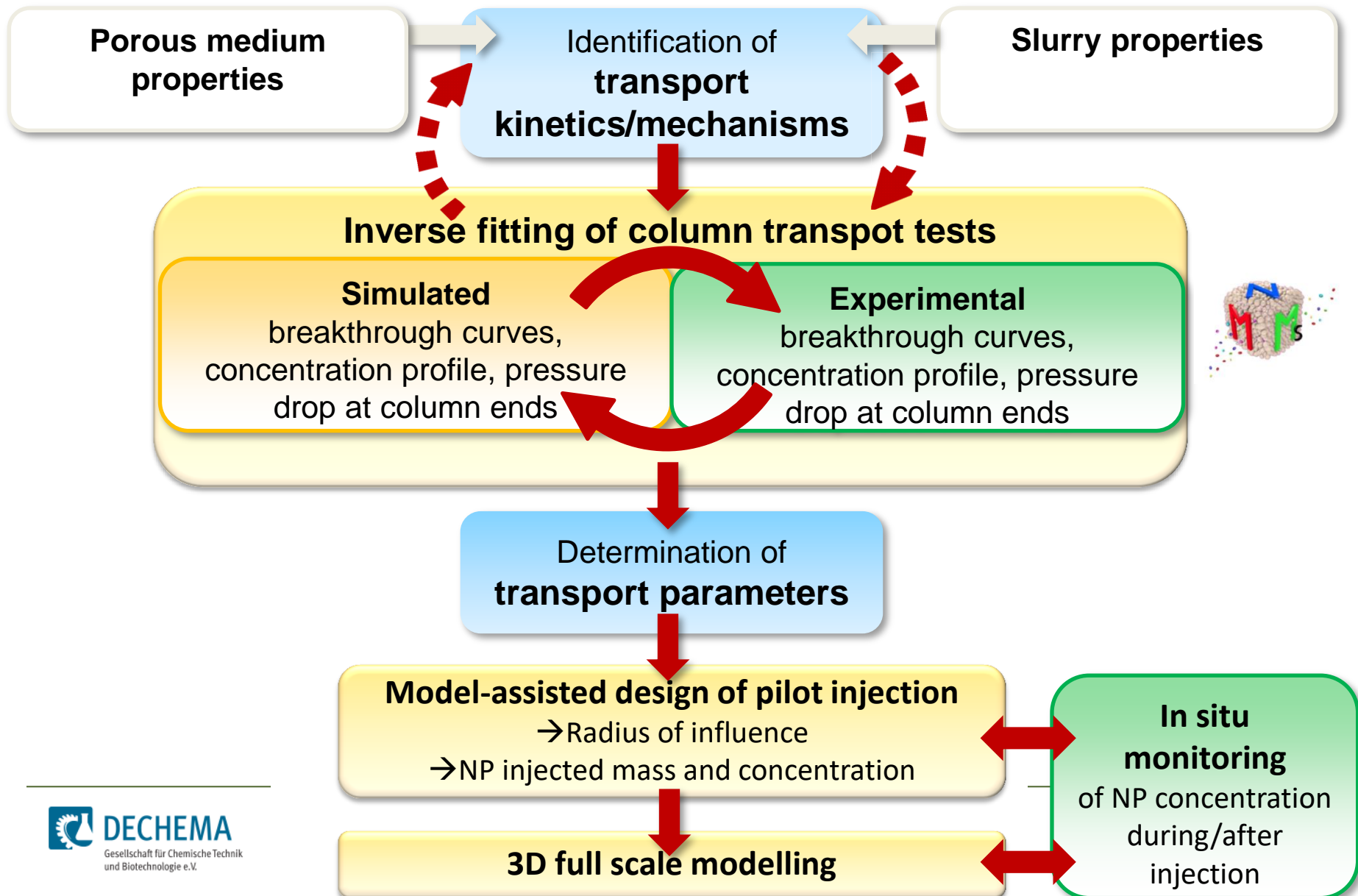


# Part III

## Examples

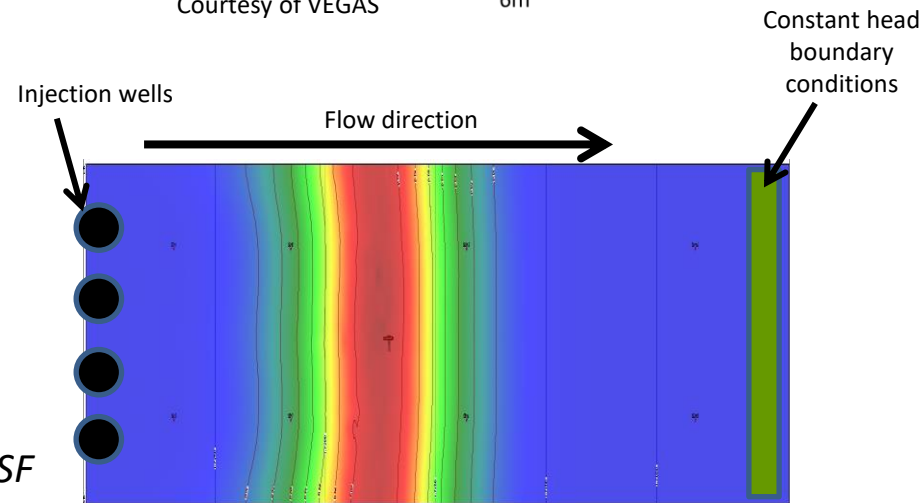
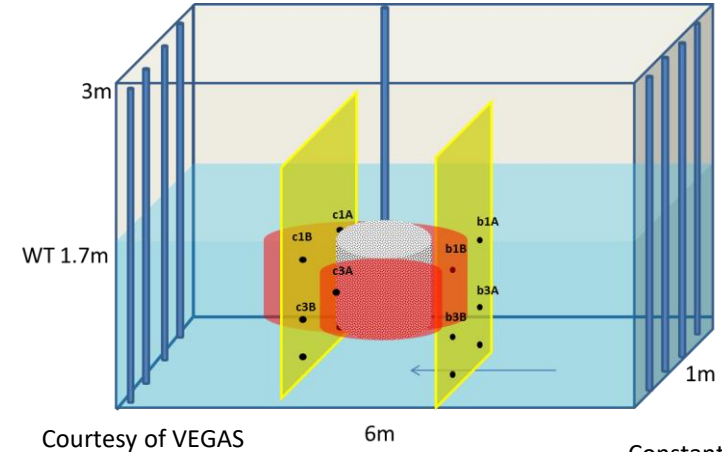


# From laboratory to field scale



# Example 1 – injection of CarbolIron in a large-scale flume

- Modeling steps:
  - Flow model: developed in collaboration with USTUTT
  - Simulation of tracer injection from the left side of the domain to calibrate the numerical model.
    - Steady state flow
    - Simulation time = 720 h
    - Injection flow rate = 0.54 m<sup>3</sup>/d

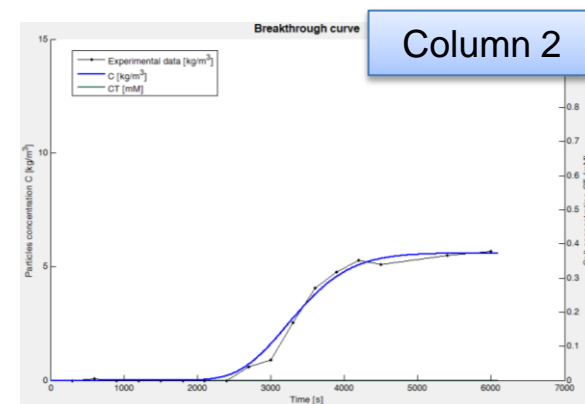
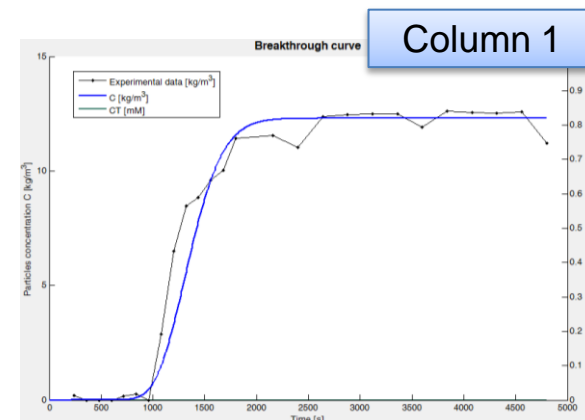
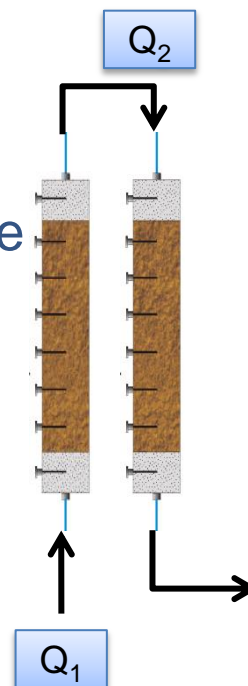


# Example 1 – injection of CarbolIron in a large-scale flume

- Modeling steps:
  - Column tests: inverse modeling of one cascading column tests (WP8) using MNMs to determine velocity-dependent coefficients.

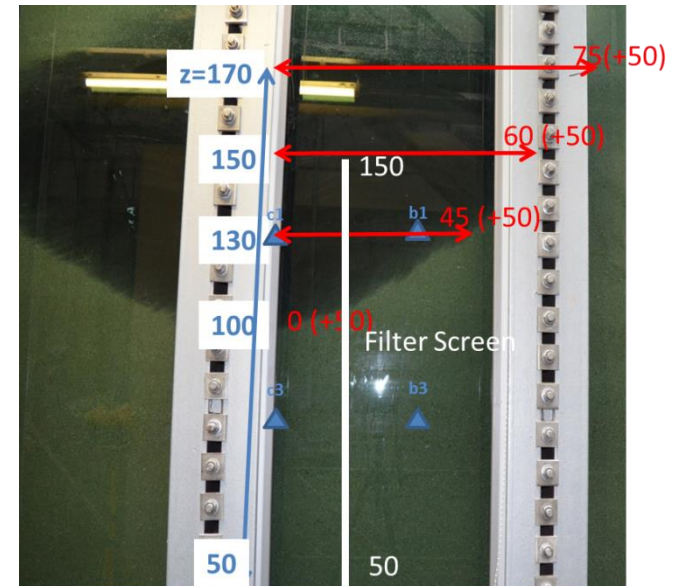
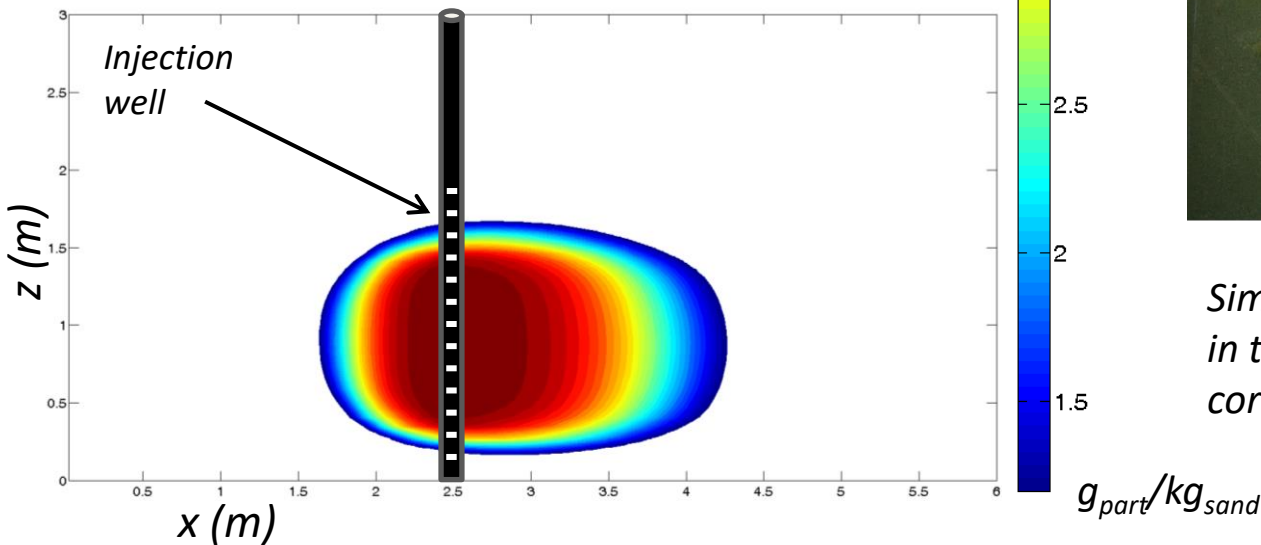
	Column 1	Column 2
Length [cm]		25
Diameter [cm]		4.4
Porosity		0.34
Dispersivity [m]		0.0039
Q [ml/min]	5.7	2.3
Inlet concentration [g/l]	14.8	8.75

- Fitting model: 1 site with irreversible attachment ( $k_a = 1.35 \cdot 10^{-4} \text{ s}^{-1}$ )
- No effect of flow velocity



# Example 1 – injection of Carbolron in a large-scale flume

- Modeling steps:
  - Simulation of the injection of Carbolron through the central well
  - Vertical section

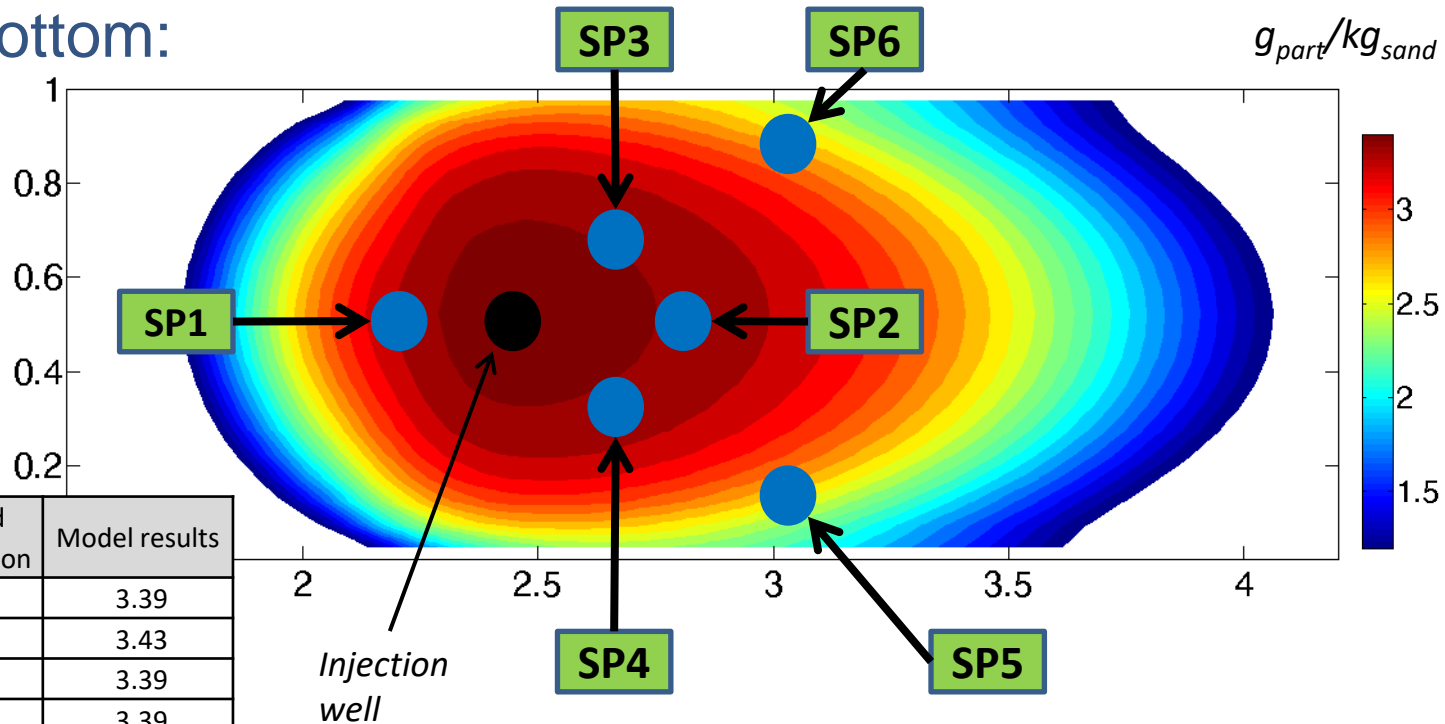


Simulation of Carbolron injection in the LSF. Plume edge corresponds to 1.2  $g/kg$

# Example 1 – injection of CarbolIron in a large-scale flume

- Core sampling at 1.3 m from the LSF bottom:

Simulation of CarbolIron injection in the LSF. Plume edge corresponds to 1.2 g/kg

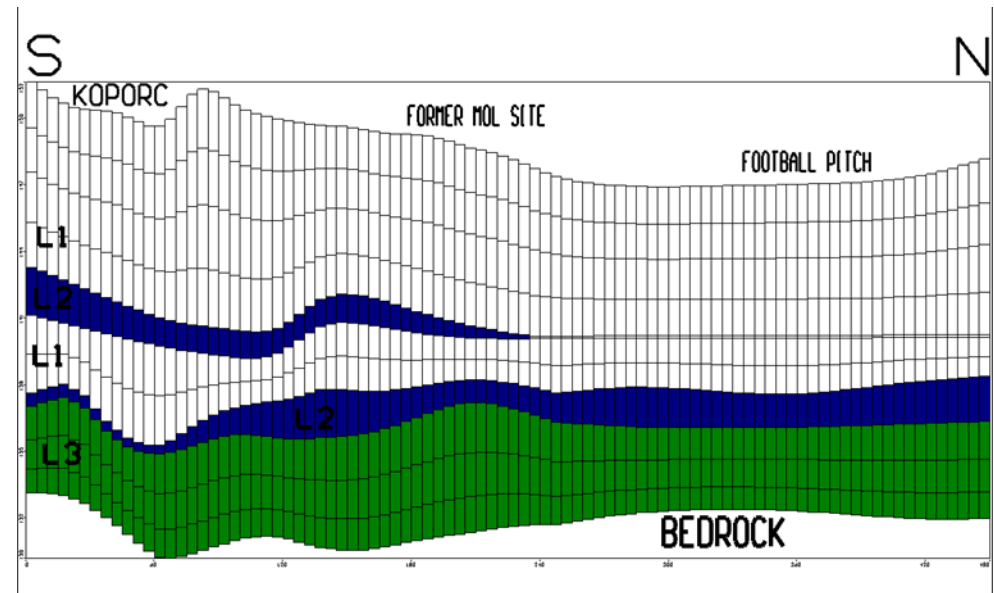


Monitoring point		Observed concentration	Model results
SP 1	g/kg	3.40	3.39
SP 2	g/kg	3.30	3.43
SP 3	g/kg	2.20	3.39
SP 4	g/kg	3.30	3.39
SP 5	g/kg	4.90	3.19
SP 6	g/kg	NO data	3.05



# Example 2 – simulation of field scale injection

- Field location: Balassagyarmat, Hungary
- Original flow model provided by GOLDER, further refined around the injection points



Courtesy of Golder

# Example 2 – simulation of field scale injection

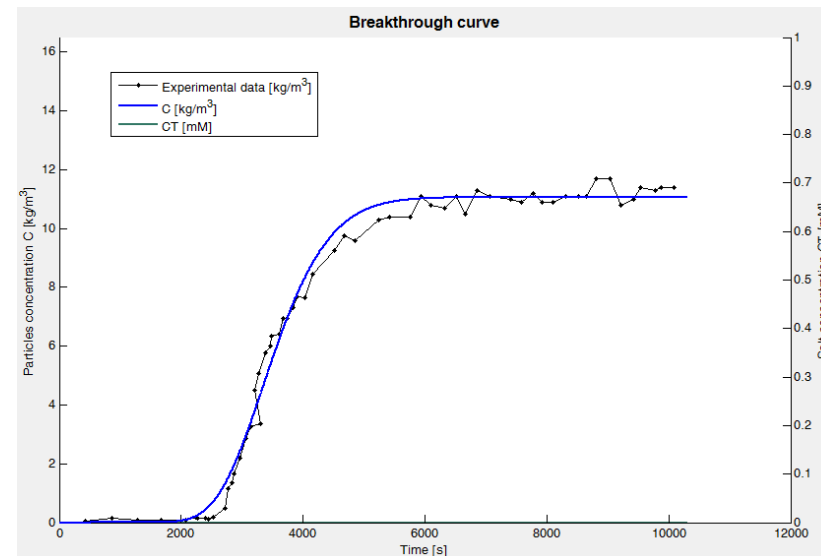
- Data from UFZ (WP4)
- Column tests of Carbolron transport in site material.
- Fitting model: 2 sites, irreversible attachment.
- Variation of porosity due to clogging is relevant

Parameter		Value
$K_{a1}$	$[s^{-1}]$	$3.29 \cdot 10^{-2}$
$K_{d1}$	$[s^{-1}]$	$7.15 \cdot 10^{-2}$
$K_{a2}$	$[s^{-1}]$	$1.24 \cdot 10^{-4}$



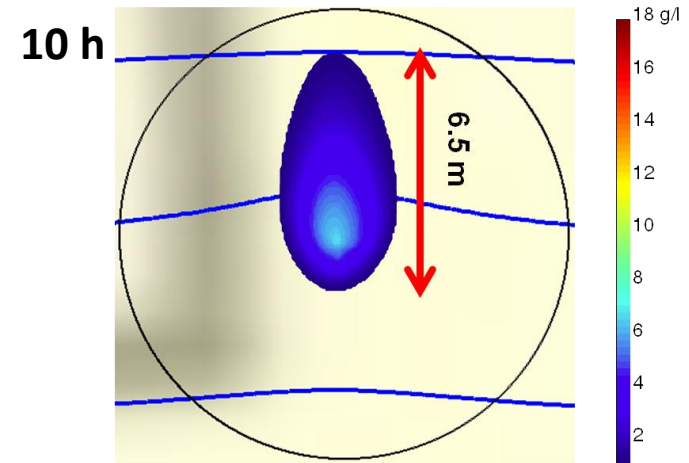
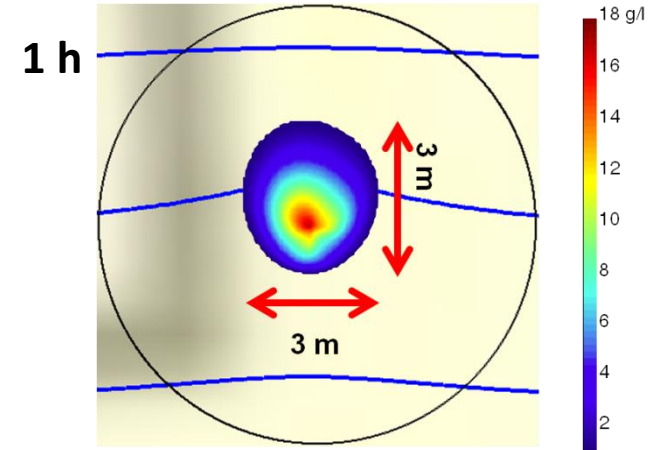
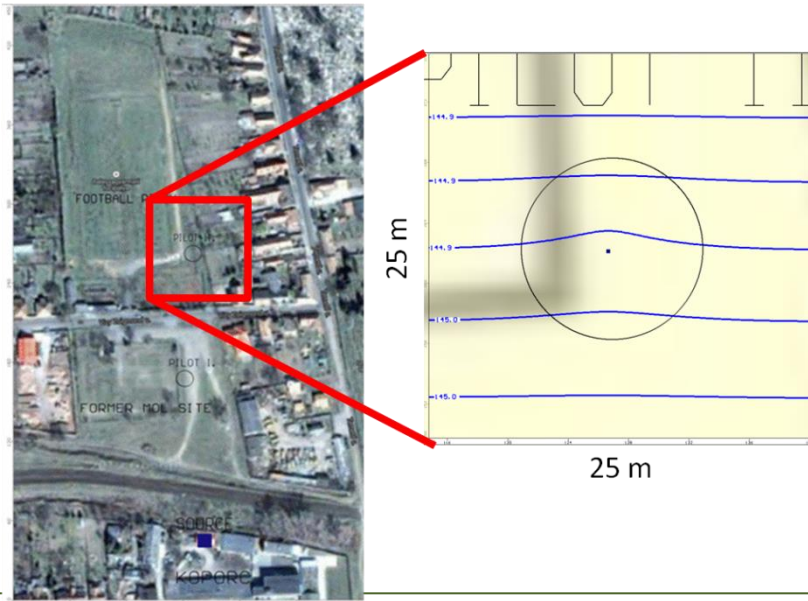
Courtesy of UFZ

Length [cm]	20
Diameter [cm]	3.5
Porosity	0.33
Dispersivity [m]	0.0041
Q [ml/min]	2
Seepage Velocity [m/d]	10
Inlet concentration [g/l]	14.8



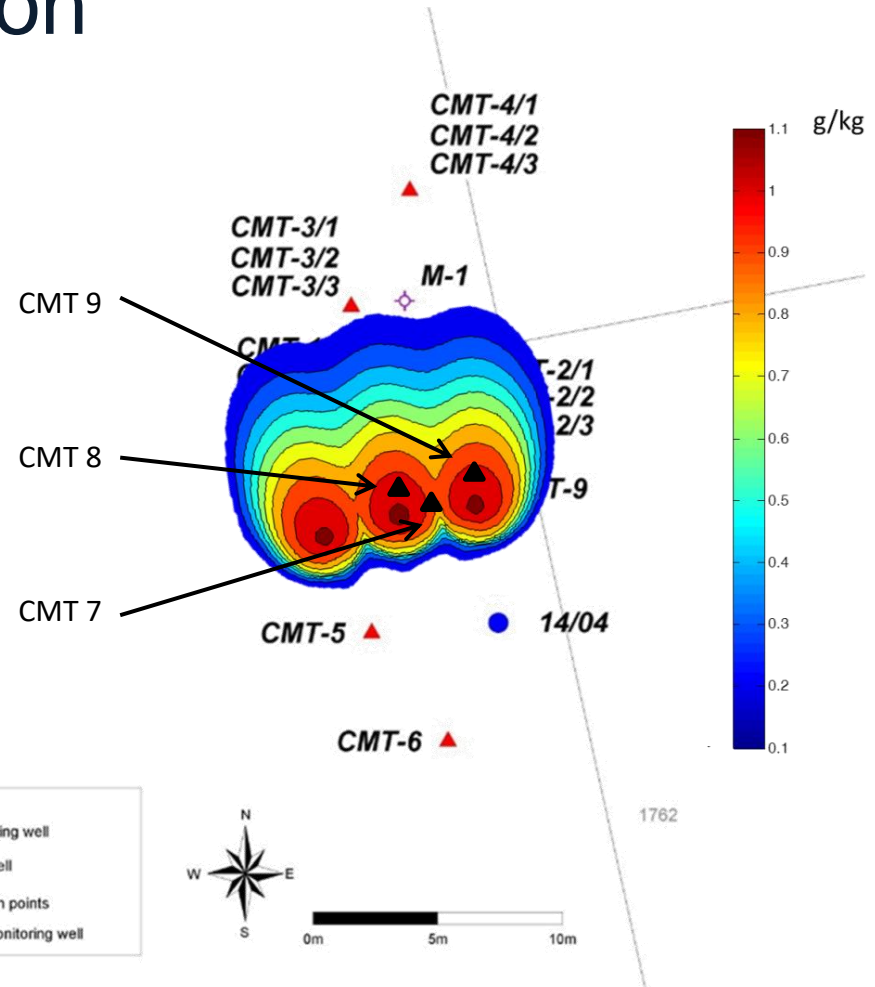
# Example 2 – simulation of field scale injection

- Simulation of Carbolron expected mobility in the field - radial injection
  - Kinetic coefficients from column test
  - $Q = 25$  l/min
  - Injection duration = 1 h



# Example 2 – simulation of field scale injection

- Background GW flow 2 m/d
- 3 Injection points
  - Particles = 15 g/L
  - CMC = 1.5 g/L
- ROI = 5 m
- Model based on more column tests may be more accurate



Monitoring point		Observed concentration	Model results
CMT 7	g/kg	0.8	0.8
CMT 8	g/kg	2	1
CMT 9	g/kg	3	1

# Thank you for your attention



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