



# Monte Carlo analysis of macro dispersion in 3D heterogeneous porous media

Arthur Dartois and Anthony Beaudoin

Institute P', University of Poitiers, France

NM2PorousMedia, Dubrovnik, Croatia– 29 Sep - 3 Oct, 2014



- 1** Introduction
- 2** PARADIS
  - Heterogeneous porous media
  - Particles transport
- 3** Previous work
  - Diffusion and local dispersion in 2D
  - Advection only in 3D
- 4** Results
  - Visualisation
  - Diffusion and local dispersion in 3D
- 5** Conclusions and outlooks

- 1** Introduction
- 2** PARADIS
  - Heterogeneous porous media
  - Particles transport
- 3** Previous work
  - Diffusion and local dispersion in 2D
  - Advection only in 3D
- 4** Results
  - Visualisation
  - Diffusion and local dispersion in 3D
- 5** Conclusions and outlooks

# Introduction

The transport of solute in geological media is a key phenomena in a lot of applications.

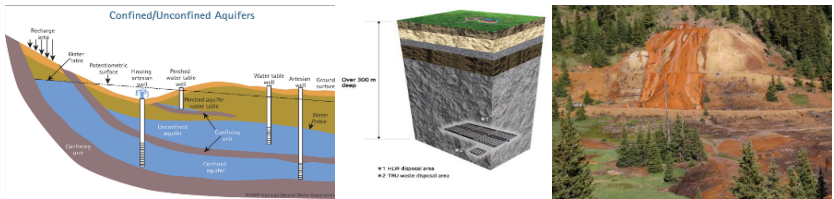


Figure 1 : Examples of applications, freshwater supply (left), geological waste disposal (middle) and remediation of mine drainage (right).

- 1 Introduction
- 2 PARADIS
  - Heterogeneous porous media
  - Particles transport
- 3 Previous work
  - Diffusion and local dispersion in 2D
  - Advection only in 3D
- 4 Results
  - Visualisation
  - Diffusion and local dispersion in 3D
- 5 Conclusions and outlooks

# Heterogeneous porous media

## Random permeability field:

Lognormale distribution  $Y = \log(K)$   
 Correlation function  $C_Y(r) = \sigma_Y^2 \exp(-|r|\lambda_Y)$

where  $\sigma^2$  is the lognormal permeability variance,  $|r|$  is the distance between two points and  $\lambda$  is the correlation length.

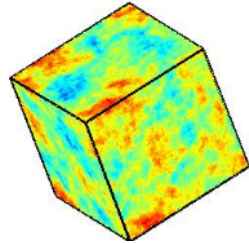


Figure 2 : Permeability field

Generation of random permeability field [G. 1989; Gelhar and al. 1993]  
 Fourier transform method using the parallel library FFTW [Frigo and al. 2005; Gutjahr and al. 1989]

# Heterogeneous porous media

## Saturated flow:

flow equation  $\nabla(K\nabla h) = 0$

Boundary conditions

- fixed head on two opposite borders
- periodic boundary conditions on the other transverse faces

Darcy's law  $v = -K/\theta \nabla h$

Finite volume scheme [Chavent and al. 1991]  
Parallel multi grid solver HYPRE [Falgout and al. 2005]

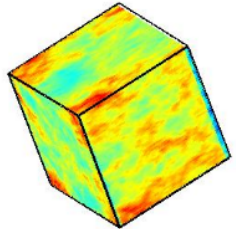


Figure 3 : Flow field

# Particles transport

Transport equation:

$$\frac{\partial \theta C}{\partial t} + \nabla \cdot (\theta C \mathbf{v}) - \nabla \cdot (\theta D \nabla C) = 0$$

$$D_{ij} = (\alpha_T |\mathbf{v}| + D_m) \delta_{ij} + \frac{(\alpha_L - \alpha_T) v_i v_j}{|\mathbf{v}|}$$

where  $\alpha_L$  and  $\alpha_T$  are the longitudinal and transverse dispersivities and  $D_m$  is the molecular diffusion coefficient.

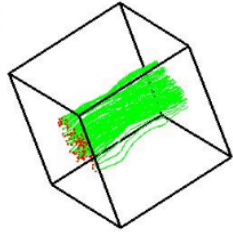


Figure 4 : Particles paths

Random walk method [Kampen and al. 1981].

Discretization using a stochastic RK method of strong order 1.5 [Burrage and Burrage 1996].

An adaptative time step depending of the maximum velocity.

Peclet related to the hydrodynamic dispersion:  $Pe_L = \lambda / \alpha_L$

Peclet related to the molecular diffusion:  $Pe = \lambda u / D_m$



# Particles transport

## Macro dispersions:

$$D_L^i(t) = \frac{1}{2\lambda u} \frac{d(\langle x^2(t) \rangle_i - \langle x(t) \rangle_i^2)}{dt}$$

$$D_T^i(t) = \frac{1}{2\lambda u} \frac{d(\langle y^2(t) \rangle_i - \langle y(t) \rangle_i^2)}{dt}$$

where  $\langle x^k(t) \rangle_i$  and  $\langle y^k(t) \rangle_i$  are the  $k$ th moments of the solute plume of the  $i$ th simulation.

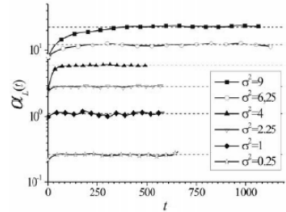


Figure 5 : Macro dispersion as function of time

The average over  $N_S$  Monte Carlo simulations is performed in a second step:

$$D_L(t) = \langle D_L^i(t) \rangle_{i=1, N_S} \quad \text{and} \quad D_T(t) = \langle D_T^i(t) \rangle_{i=1, N_S}$$

- 1 Introduction
- 2 PARADIS
  - Heterogeneous porous media
  - Particles transport
- 3 Previous work
  - Diffusion and local dispersion in 2D
  - Advection only in 3D
- 4 Results
  - Visualisation
  - Diffusion and local dispersion in 3D
- 5 Conclusions and outlooks

# Diffusion and local dispersion in 2D

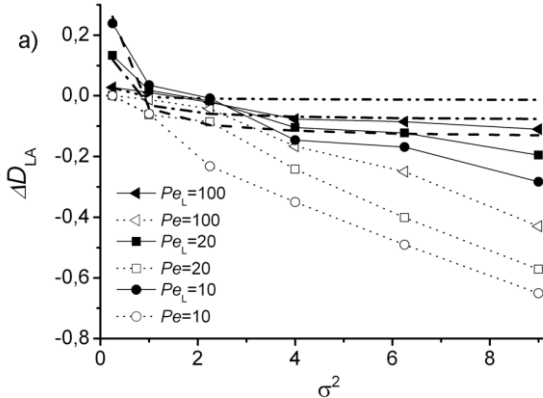


Figure 6 : Relative difference of longitudinal macro dispersion as function of  $\sigma_y^2$  for various values of  $Pe$  and  $Pe_L$ .

[Dreuzy, Beaudoin, and Erhel 2007; Beaudoin, Dreuzy, and Erhel 2010]

## Diffusion and local dispersion in 2D

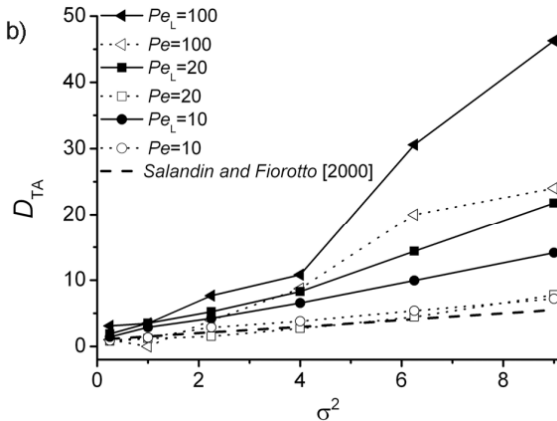


Figure 7 : Transverse macro dispersion as function of  $\sigma^2$  for various values of  $Pe$  and  $Pe_L$ .

[Dreuzy, Beaudoin, and Erhel 2007; Beaudoin, Dreuzy, and Erhel 2010]

In conclusion in 2D:

- Diffusion induces a reduction of the longitudinal macro dispersion coefficient twice as large as local dispersion.
- Dispersion due to permeability heterogeneities amplifies the transverse macro dispersion coefficient 1.5-3 times as much as diffusion.

It's explain by the fact that the local dispersion is larger than diffusion in the high velocity zones whereas diffusion is larger than the local dispersion in the low velocity zones.

# Advection only in 3D

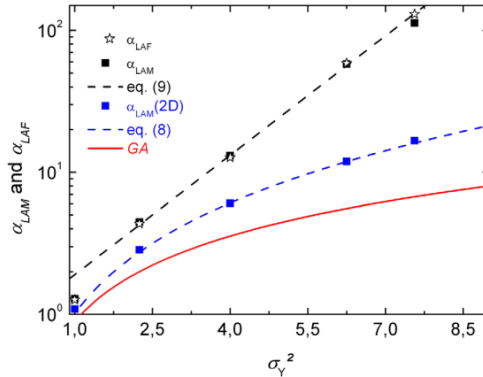


Figure 8 : Longitudinal macro dispersion estimated by fitting the time dependent dispersivities  $\alpha_{LAF}$  and by its long-time averaging  $\alpha_{LAM}$  as function of  $\sigma^2$ .

The longitudinal macrodispersivity is compared to the value obtained numerically in 2D (blue squares) and to the perturbative approximation [Gelhar and al. 1983] (red line).

# Advection only in 3D

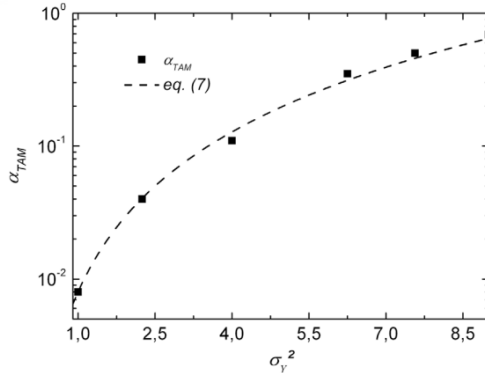


Figure 9 : Transverse macro dispersion estimated by its long-time averaging  $\alpha_{TAM}$  as function of  $\sigma_y^2$ .

[Dreuzy, Beaudoin, and Erhel 2007; Beaudoin and Dreuzy 2013]

- 1 Introduction
- 2 PARADIS
  - Heterogeneous porous media
  - Particles transport
- 3 Previous work
  - Diffusion and local dispersion in 2D
  - Advection only in 3D
- 4 Results
  - Visualisation
  - Diffusion and local dispersion in 3D
- 5 Conclusions and outlooks



# Visualisation

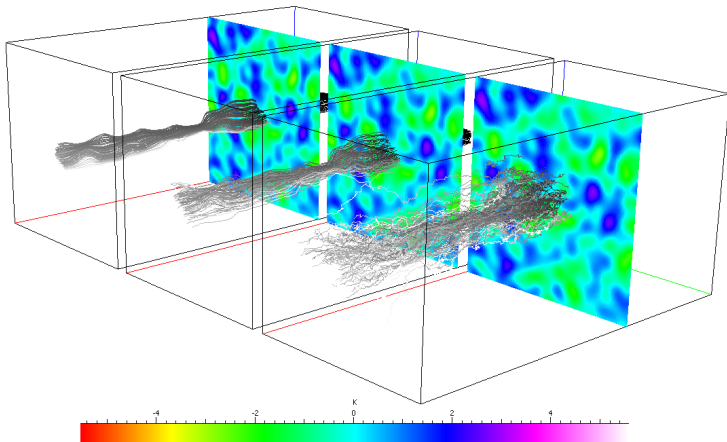


Figure 10 : Particles paths in a permeability field with  $\sigma^2 = 1$  and several value of Peclet (from left to right:  $Pe = 1000$ ,  $Pe = 100$ ,  $Pe = 10$ ).

# Visualisation

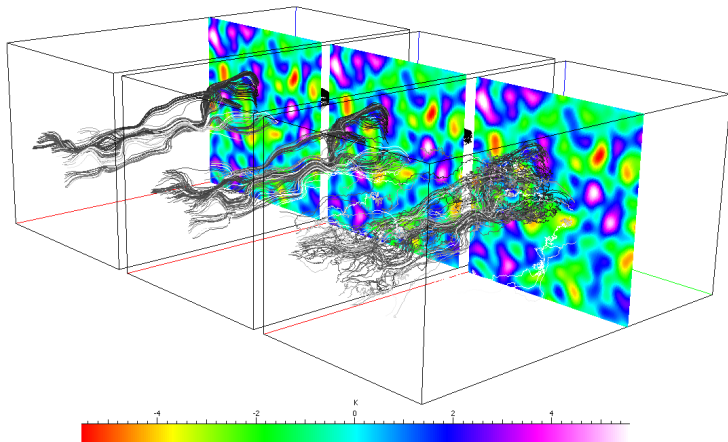


Figure 11 : Particles paths in a permeability field with  $\sigma^2 = 4$  and several value of Peclet (from left to right:  $Pe = 1000$ ,  $Pe = 100$ ,  $Pe = 10$ ).

## Visualisation

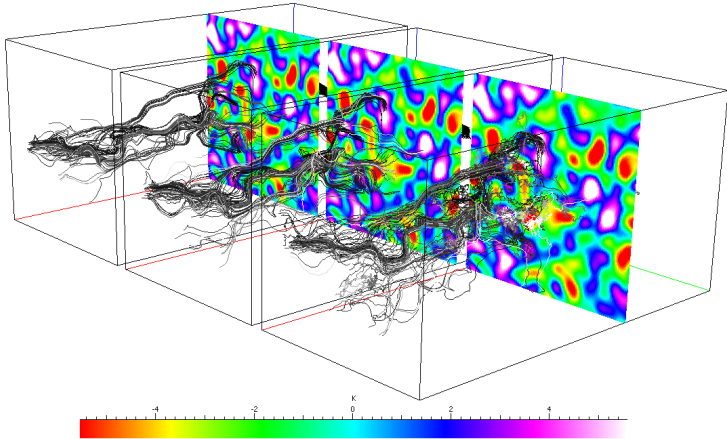


Figure 12 : Particles paths in a permeability field with  $\sigma^2 = 9$  and several value of Peclet (from left to right:  $Pe = 1000$ ,  $Pe = 100$ ,  $Pe = 10$ ).

# Longitudinal Macro dispersion

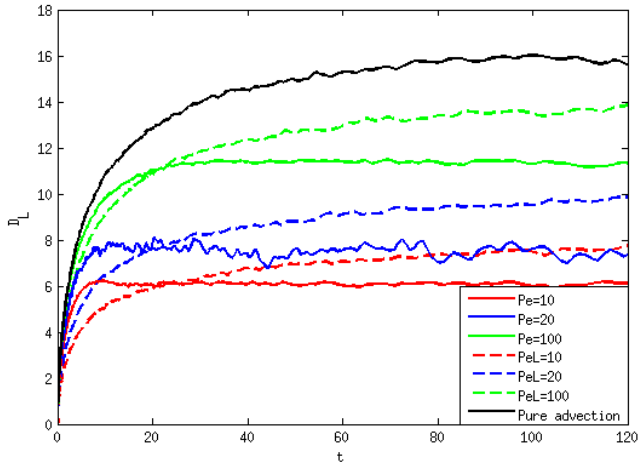


Figure 13 : Longitudinal macro dispersion  $D_L$  as a function of time for several value of  $Pe$  and  $Pe_L$  for  $\sigma^2 = 4$ .

# Transversal Macro dispersion

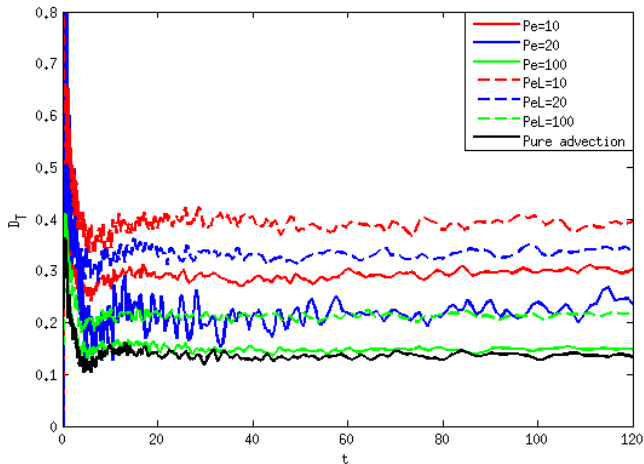


Figure 14 : Transverse macro dispersion  $D_T$  as a function of time for several value of  $Pe$  and  $Pe_L$  for  $\sigma^2 = 4$ .

# Longitudinal macro dispersion

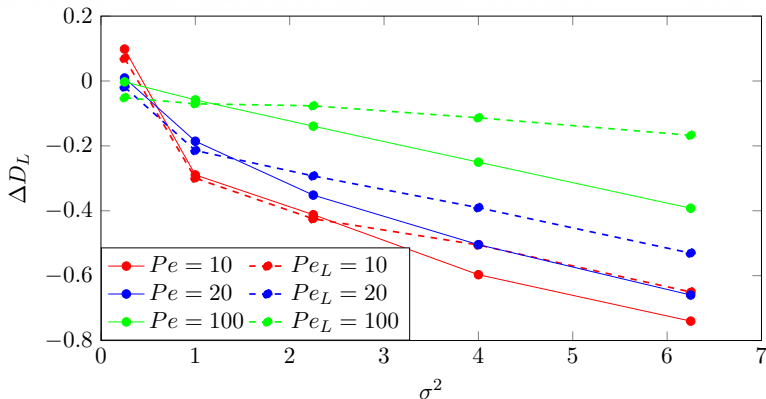


Figure 15 : Relative difference of longitudinal macro dispersion  $\Delta D_L$  as a function of  $\sigma^2$  for different value of  $Pe$  and  $Pe_L$ .

# Transversal macro dispersion

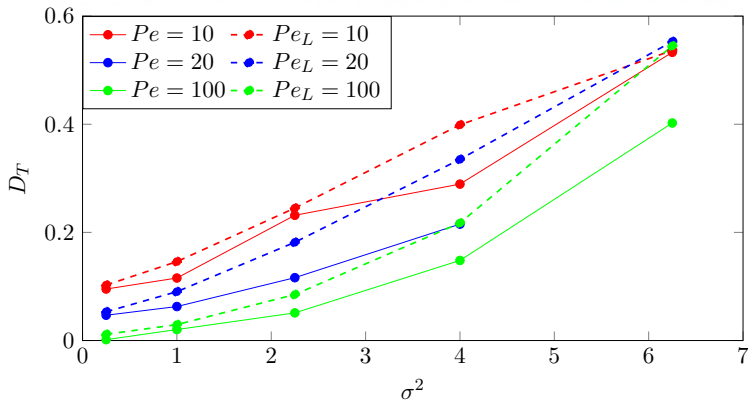


Figure 16 : Transversal macro dispersion as a function of  $\sigma^2$  for different values of  $Pe$  and  $Pe_L$ .

## Macro dispersion conclusions

For the longitudinal macro dispersion:

- The effect of diffusion and local dispersion is stronger in 3D than in 2D.
- The difference between the impact of diffusion and local dispersion is smaller in 3D

For the transverse macro dispersion:

- We have a positive impact on the transverse macro dispersion from the diffusion and the local dispersion
- The local dispersion still has also a stronger impact on the transverse macro dispersion than the diffusion
- The amplification observed from the heterogeneity in 2D is almost non-existent in 3D



- 1 Introduction
- 2 PARADIS
  - Heterogeneous porous media
  - Particles transport
- 3 Previous work
  - Diffusion and local dispersion in 2D
  - Advection only in 3D
- 4 Results
  - Visualisation
  - Diffusion and local dispersion in 3D
- 5 Conclusions and outlooks

## Conclusions:

- We have almost completed the study of the impact of molecular diffusion and local dispersion on the macro dispersion in 3D.
- We haven't been able yet to compute the asymptotic value of the macro dispersion for  $\sigma^2 = 9$ .

## Outlooks:

- We are currently working on visualisations methods to increase our understanding of these phenomena (implementation of .vtk output).
- The next step will be the implementation of chemical reaction between particles.
- We are also investigating a new method of particles transport which should reduce the computations times by an huge factor.

Thank you for your attention!

# Bibliography I



A. Beaudoin and J.-R. de Dreuzy. "Numerical assessment of 3D macrodispersion in heterogeneous porous media". In: *Water Ressources Research* 43 (2013).



A. Beaudoin, J.-R. de Dreuzy, and J. Erhel. "Numerical Monte Carlo analysis of the influence of pore-scale dispersion on macrodispersion in 2D heterogeneous porous media". In: *Water Ressources Research* 46 (2010).



K. Burrage and P.M Burrage. "High strong order explicit Runge-Kutta methods for stochastic ordinary differential equations". In: *Applied Numerical Mathematics* 22 (1996).



Chavent and al. "A unified physical presentation of mixed, mixed-hybrid finite elements and standard finite difference approximations for the determination of velocities in waterflow problems". In: *Adv. Water Ressources* 14 (1991).

## Bibliography II



J.-R. de Dreuzy, A. Beaudoin, and J. Erhel. "Asymptotic dispersion in 2D heterogeneous porous media determined by parallel numerical simulations". In: *Water Resources Research* 43 (2007).



Falgout and al. "Pursuing scalability for HYPRE's conceptual interfaces". In: *ACM Trans. Math. Software* 31 (2005).



Frigo and al. "The design and implementation of FFTW3". In: *Proc. IEEE* 93 (2005).



Dagan G. "Flow and transport in porous formations". In: *Springer Verlag* (1989).



Gelhar and al. "Stochastic subsurface hydrology". In: *Engelwood Cliffs, New Jersey* (1993).



Gelhar and al. "Three dimensional stochastic analysis of macrodispersion in aquifers". In: *Water Resources Research* 19 (1983).



Gutjahr and al. "Fast Fourier transforms for random field generation". In: *New Mexico Tech project report* (1989).



Van Kampen and al. "Stochastic Processes in Physics and Chemistry". In: *Elsevier Sci.* (1981).