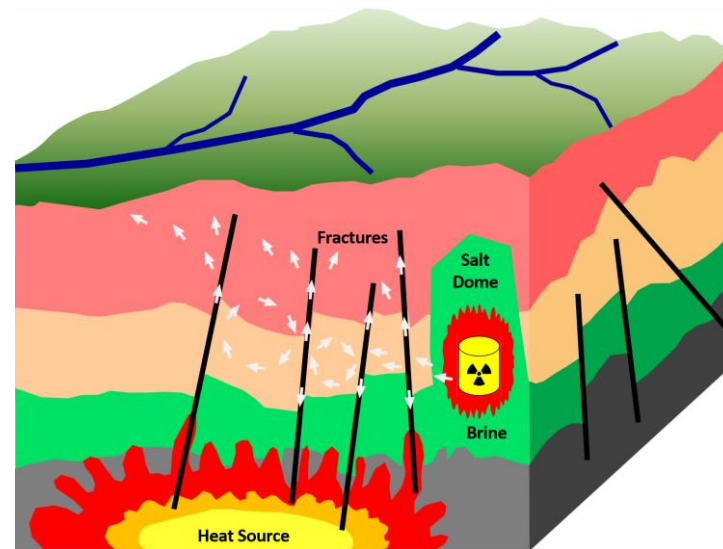
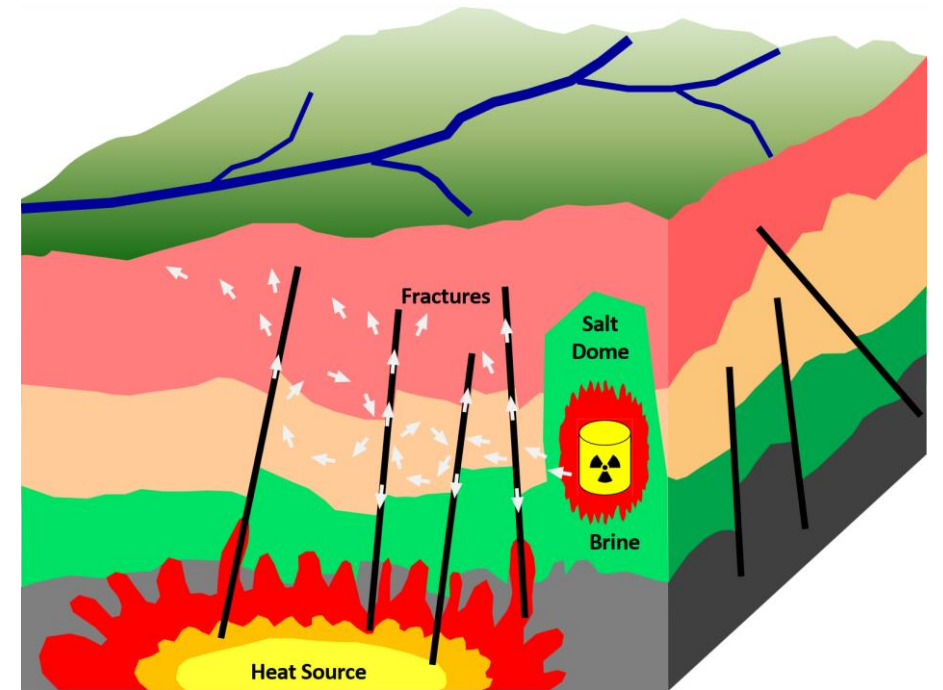
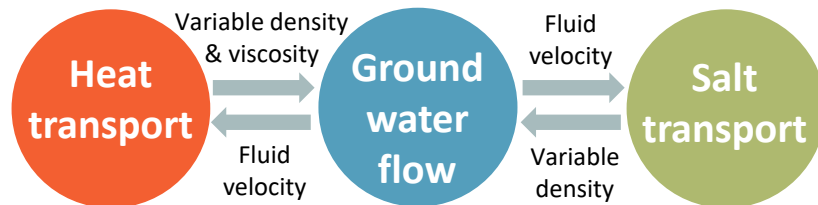


# Sensitivity of Salt Concentration and Groundwater Age to Dispersivity in the Salt Dome Problem



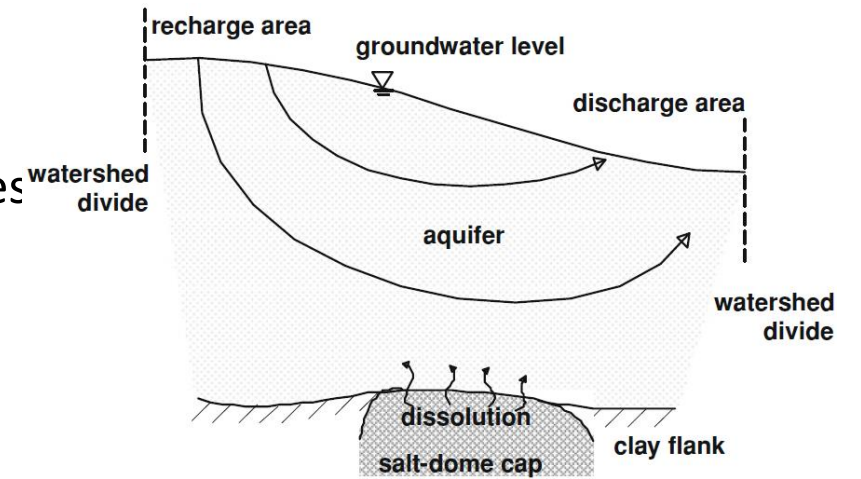
## Motivation

- Relevant processes in far field of salt dome:
  - Density-dependent flow
  - Heat transport (variable viscosity flow)
  - Potential radionuclide migration
  - Groundwater age (as exclusion criterium)

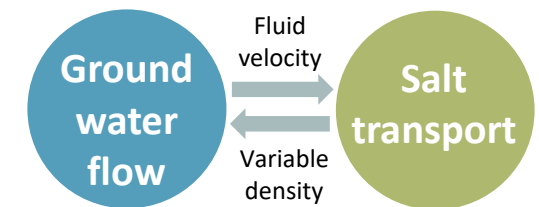


## Salt dome problem

- Simplified hydrogeological situation above Gorleben salt dome
- **Density-dependent flow** benchmark problem for numerical codes
- Strong coupling of flow and transport (density variation of 20 %)
- Intensively investigated in the 80's and 90's (Herbert et al. 1988, Oldenburg and Pruess 1995, Kolditz et al. 1998, etc.)
- Different diffusion coefficients and dispersivities used

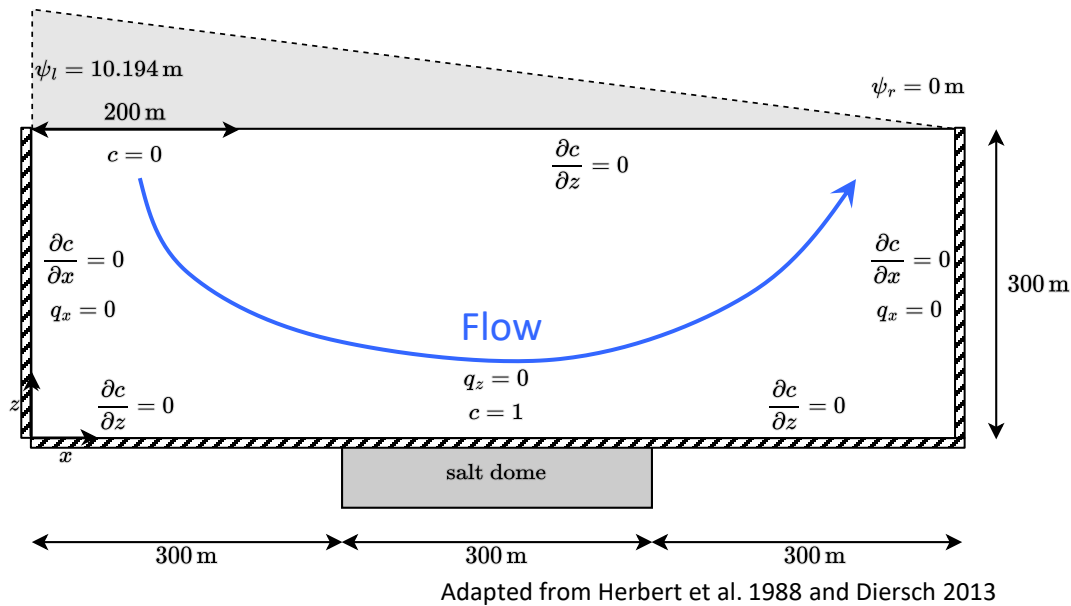


Holzbecher et al. 2010

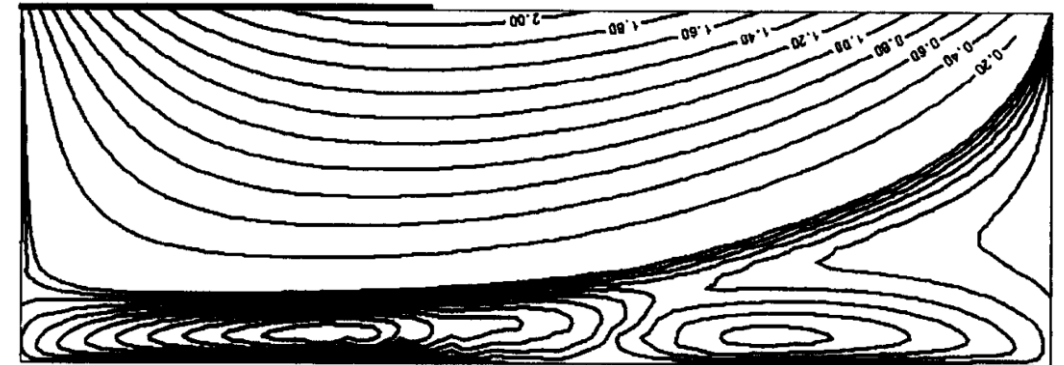


# Salt dome Problem

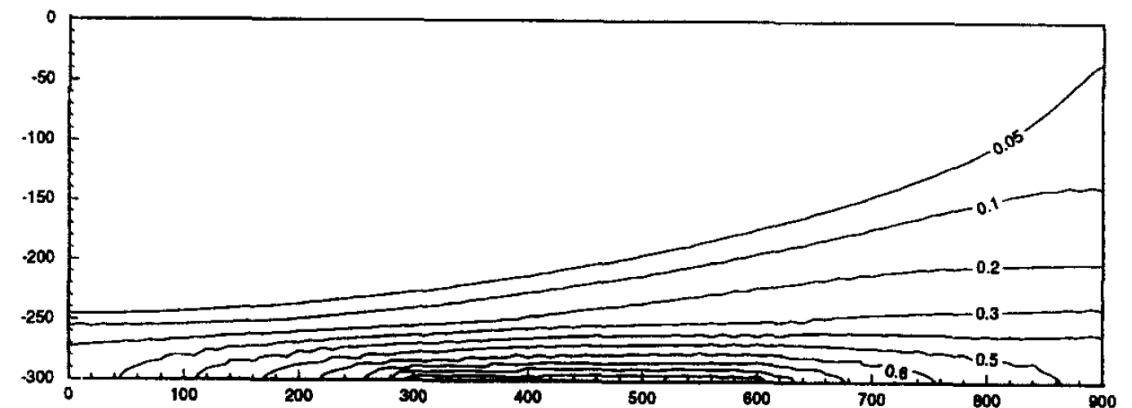
Conceptual model:



Flow solution (steady state):

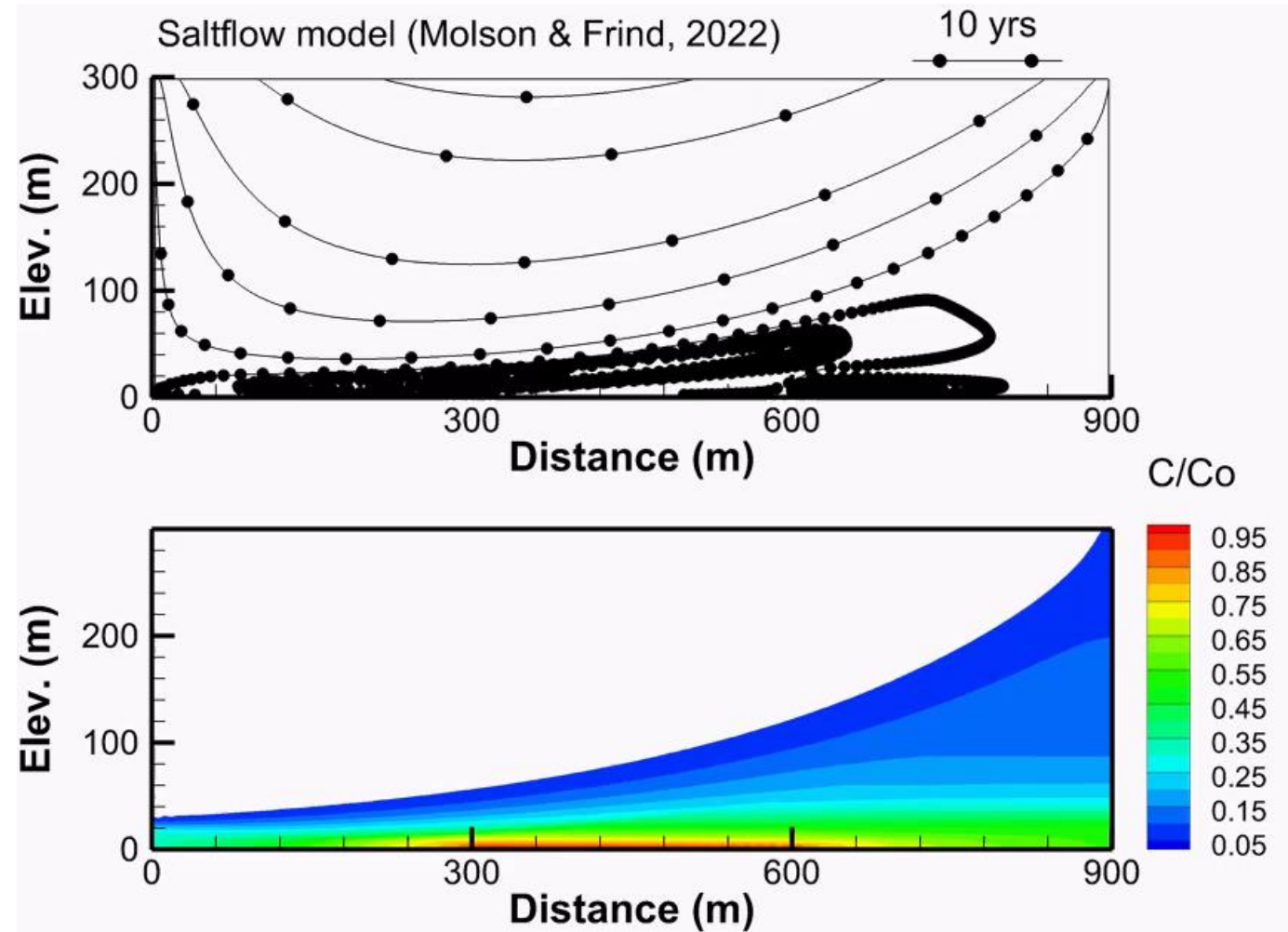


Transport solution (steady state):



## Salt Dome Problem

- Base case from literature:  
 $\alpha_L = 20 \text{ m}$ ,  $\alpha_T = 2 \text{ m}$ ,  $D = 1.39\text{e-}8 \text{ m}^2/\text{s}$
- 150x75 elements
- Steady-state flow field:
  
- Steady-state salt concentration:



## Governing Equations

Darcy equation:

$$\mathbf{q}_i = -\mathbf{K}_{ij} \left[ \frac{\partial \psi}{\partial x_j} + \rho_r \mathbf{n}_j \right]$$

Flow equation:

$$\frac{\partial}{\partial x_i} \left[ \mathbf{K}_{ij} \left( \frac{\partial \psi}{\partial x_j} + \gamma c \mathbf{n}_j \right) \right] = S_s \frac{\partial \psi}{\partial t}$$

Mass transport equation:

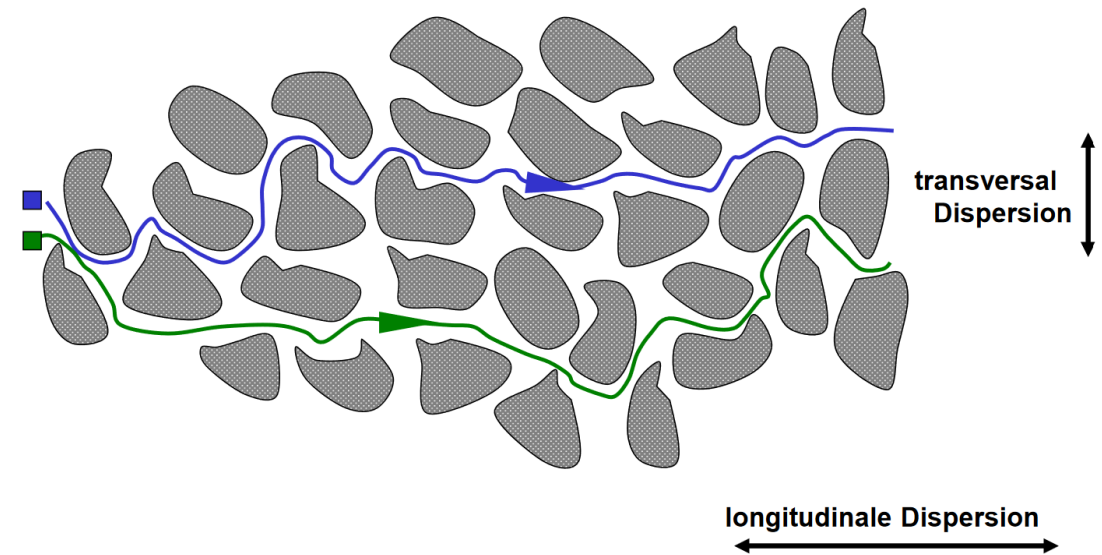
$$\frac{\partial}{\partial x_i} \left( \mathbf{D}_{ij} \frac{\partial c}{\partial x_j} \right) - \mathbf{v}_i \frac{\partial c}{\partial x_i} = \frac{\partial c}{\partial t}$$

Saltflow code (Molson and Frind 2022)

## Methods – Dispersion

- Molecular diffusion
- Dispersion (macroscopic):
  - Mixing effect due to aquifer heterogeneity
  - Different flow paths
  - Dependent on flow velocity
  - Longitudinal dispersivity in flow direction
  - Transverse dispersivity perpendicular to flow

$$\frac{\partial}{\partial x_i} \left( \mathbf{D}_{ij} \frac{\partial c}{\partial x_j} \right) - \mathbf{v}_i \frac{\partial c}{\partial x_i} = \frac{\partial c}{\partial t}$$

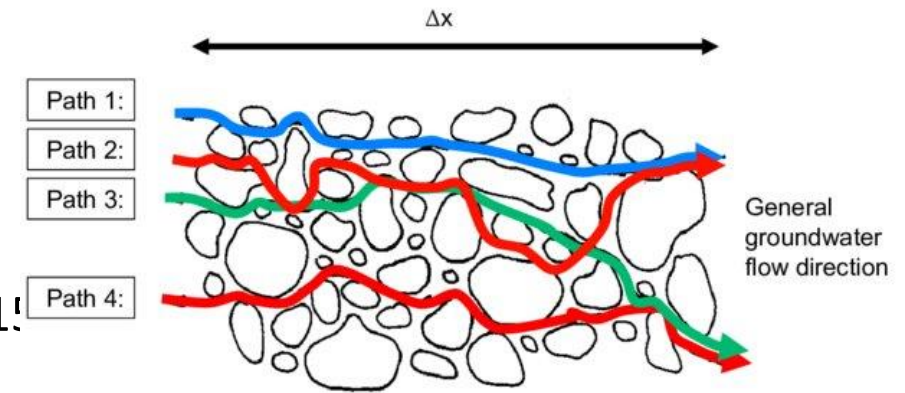


Graf 2022: Lecture on Groundwater modeling

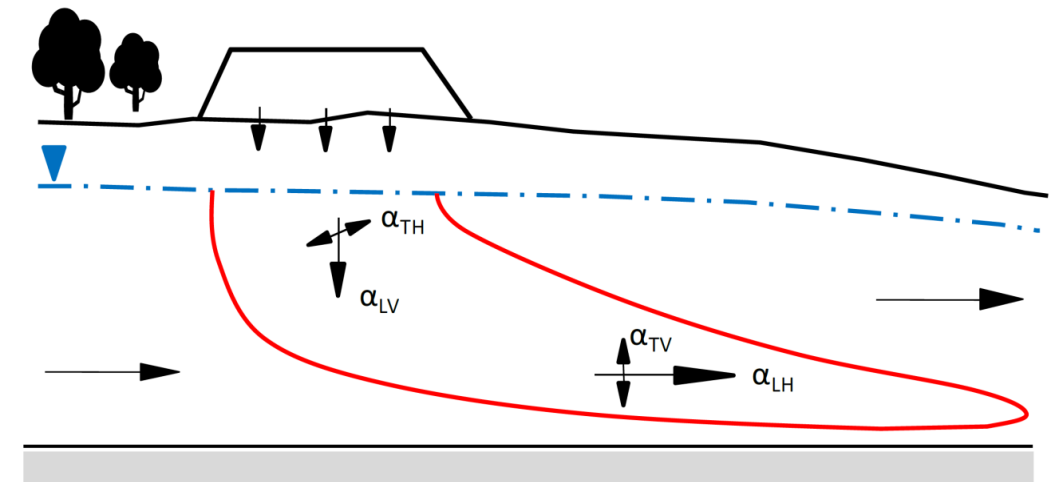


## Methods – Dispersion formulation

- Macro dispersion increases with travel distance
- Despite many attempts: No universal scaling law (Zech et al. 2011)
- Dispersivities are largely site-specific
- $\alpha_L \approx 0.1 - 0.01 \alpha_{TH}$
- $\alpha_{TH} \approx 0.1 \alpha_{TV}$  (Zech et al. 2019)
- BUT, fixed ratios are site-specific
- Chose independently
- Dispersivities are subject of large uncertainty



Torgersen et al. 2013

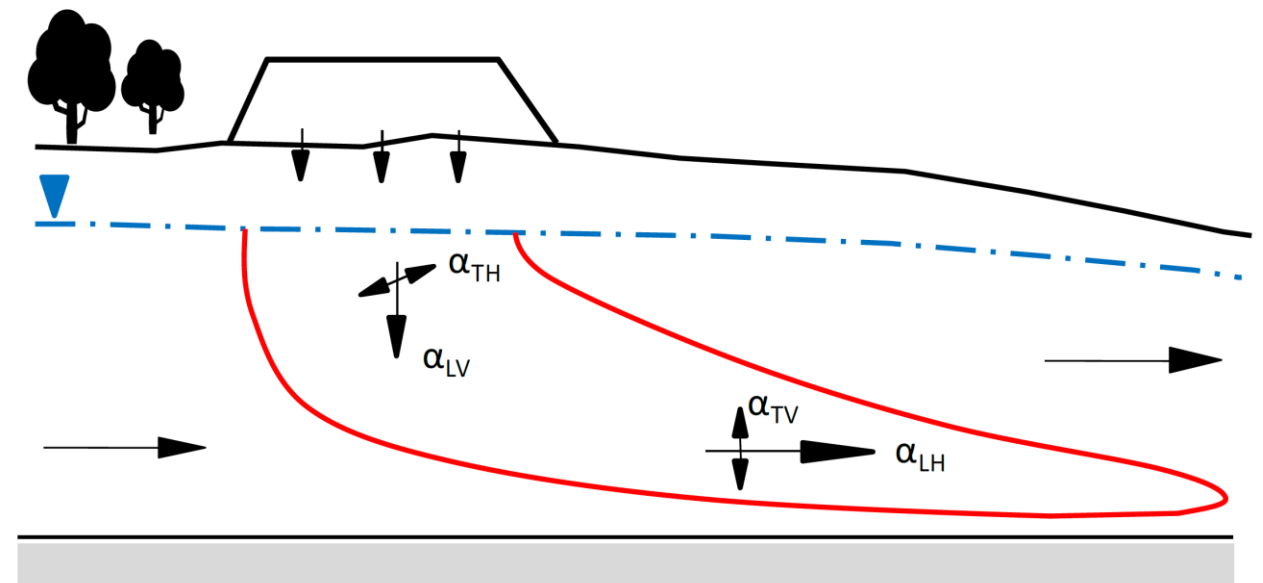


Molson and Frind 2022



## Methods – Dispersion formulation

- Lichtner et al. 2002 dispersion formulation
- General approach
  - 2 dispersivities in 2D
  - Longitudinal (flow direction)
  - Vertical (perpendicular to flow)
- 4 dispersivities Lichtner formulation
- Flow direction dependent



Molson and Frind 2002

## Research objective

- **Global Sensitivity analysis** on direction-dependent dispersivities
  - Conducted for other DDF problems (Younes et al. 2020, Fahs et al. 2022)
  
- Global Sensitivity Analysis on:
  - Classic DDF salt dome problem (salt concentration)
  - Groundwater age distribution
  - Groundwater life expectancy (LE)
  - Total residence time of Groundwater

### Uncertain dispersivity range

	Min	max
$\alpha_{LH}$	5 m	40 m
$\alpha_{LV}$	2.5 m	20 m
$\alpha_{TH}$	0.5 m	4 m
$\alpha_{TV}$	0.05 m	0.4 m

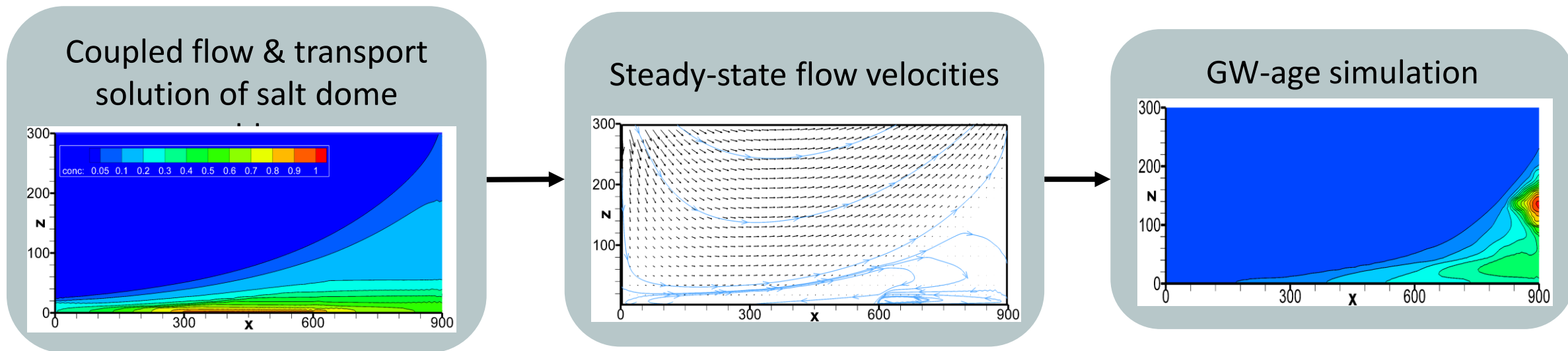
*Understand the effect of uncertain dispersivities on DDF salt dome problem, resulting groundwater age and life expectancy using Global Sensitivity Analysis*

# Methods – Groundwater age simulation

Groundwater age simulation with transport equation:

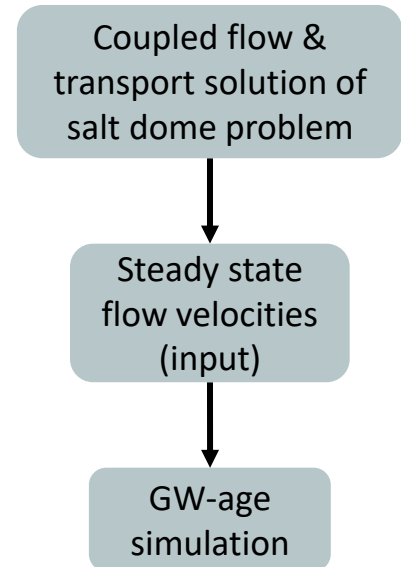
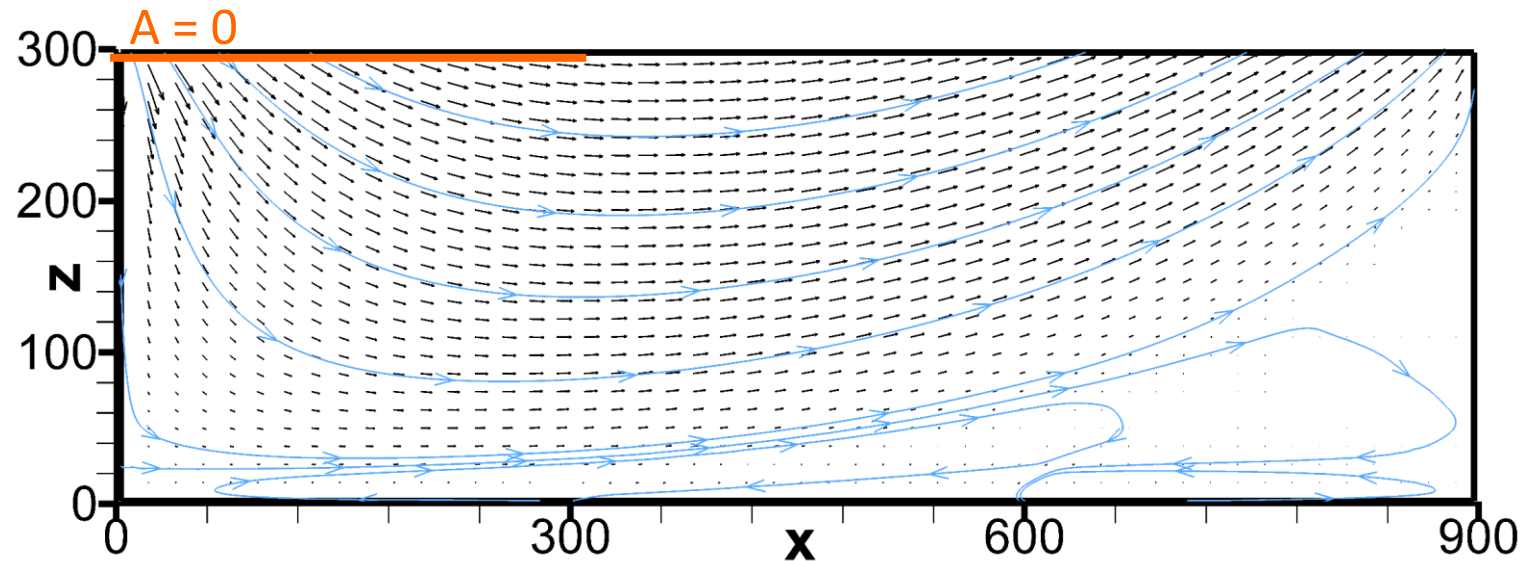
$$\frac{\partial}{\partial x_i} \left( \mathbf{D}_{ij} \frac{\partial A}{\partial x_j} \right) - \mathbf{v}_i \frac{\partial A}{\partial x_i} + 1 = 0$$

Simulation workflow:



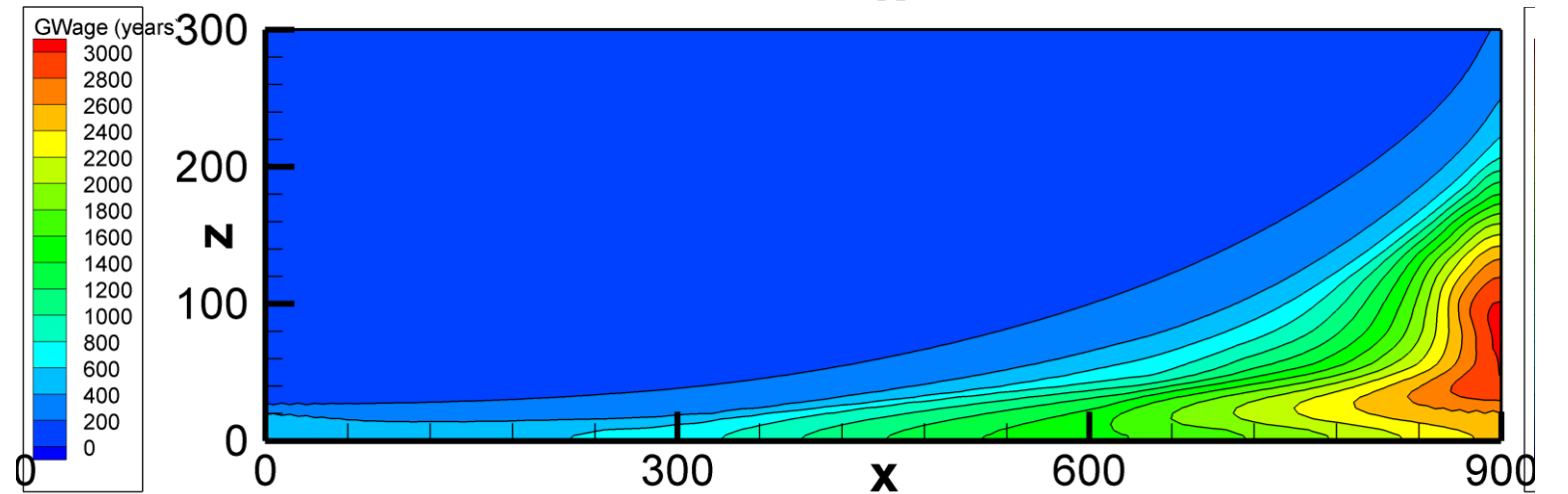
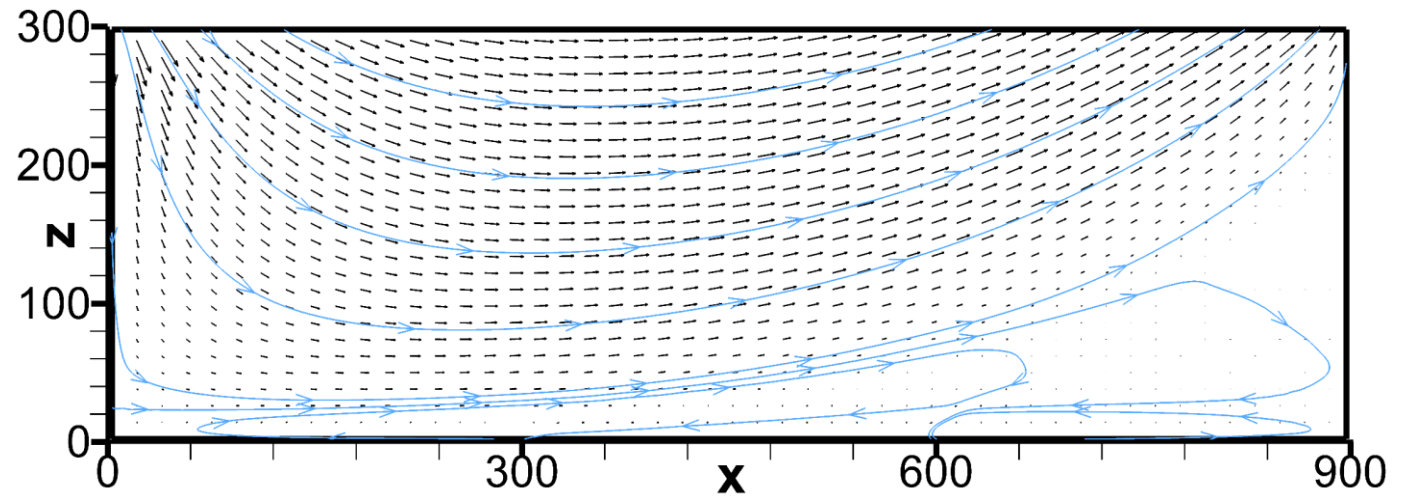
## Methods – Groundwater age simulation

- Groundwater age distribution for 150x75 elements
- ( $D = 1.39e-8 \text{ m}^2/\text{s}$ ;  $\alpha_L = 20 \text{ m}$ ;  $\alpha_T = 2 \text{ m}$ )
- Steady-state flow velocities as input:
- BC at inflow region:  $A = 0$



## Methods – Groundwater age simulation

- Groundwater age distribution:
- 150x75 elements
- $D = 1.39e8 \text{ m}^2/\text{s}$ ;  $\alpha_L = 20 \text{ m}$ ;  $\alpha_T = 2 \text{ m}$



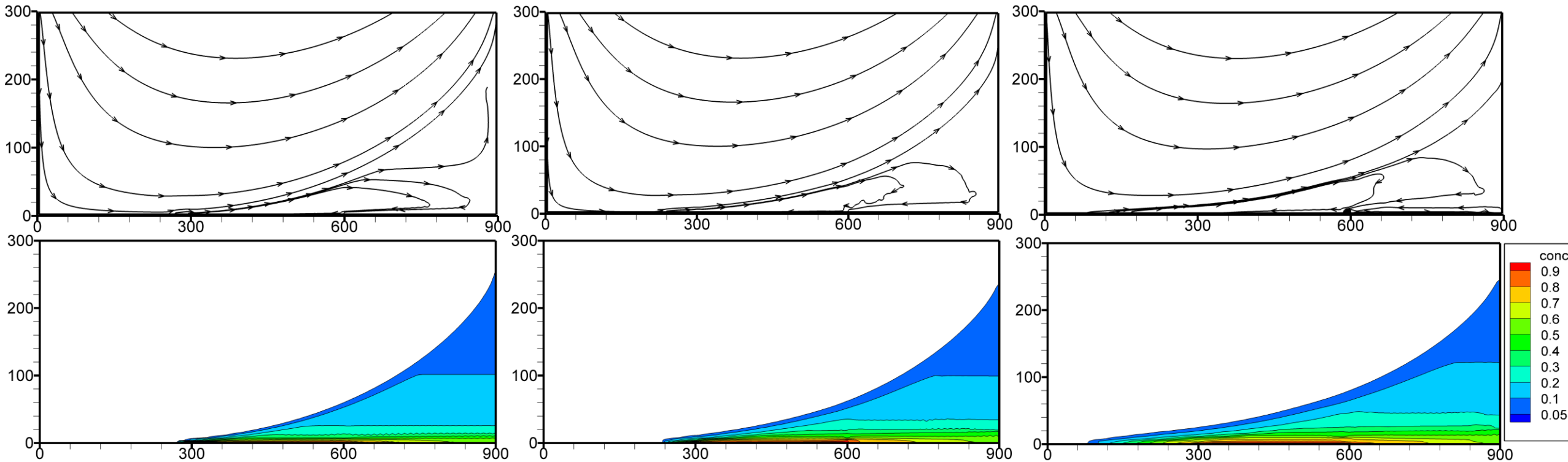
# Global Sensitivity analysis on dispersivities – Initial screening

- Steady state salt concentration & flow

Lowest dispersivity combination  
 $\alpha_{LH} = 5 \text{ m}$ ,  $\alpha_{LV} = 2.5 \text{ m}$ ,  $\alpha_{TH} = 0.5 \text{ m}$ ,  $\alpha_{TV} = 0.05 \text{ m}$

„Base case“ dispersivity combination

Lowest dispersivity combination  
 $\alpha_{LH} = 40 \text{ m}$ ,  $\alpha_{LV} = 20 \text{ m}$ ,  $\alpha_{TH} = 4 \text{ m}$ ,  $\alpha_{TV} = 0.4 \text{ m}$



# Global Sensitivity analysis on dispersivities – Initial screening

- Groundwater age

Lowest dispersivity combination  
 $\alpha_{LH} = 5 \text{ m}$ ,  $\alpha_{LV} = 2.5 \text{ m}$ ,  $\alpha_{TH} = 0.5 \text{ m}$ ,  $\alpha_{TV} = 0.05 \text{ m}$

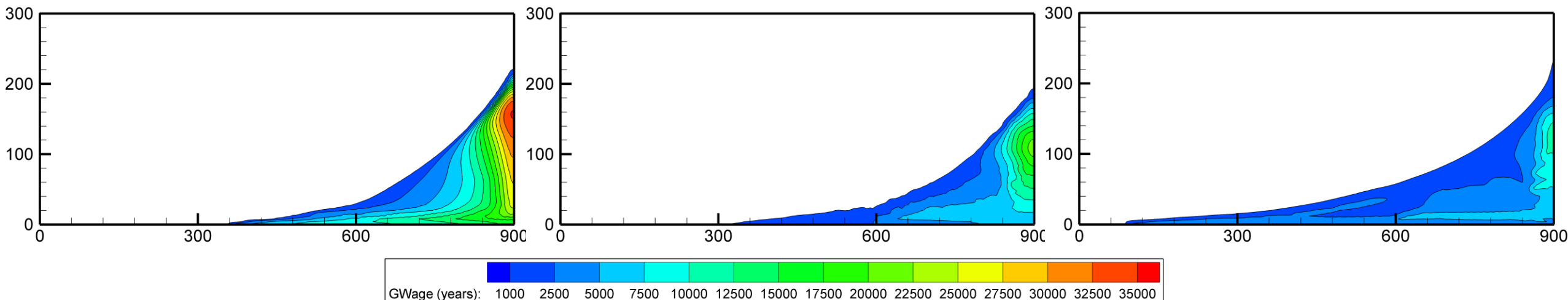
Max GW age: 35,306 yrs

„Base case“ dispersivity combination  
 $\alpha_{LH} = 20 \text{ m}$ ,  $\alpha_{LV} = 10 \text{ m}$ ,  $\alpha_{TH} = 2 \text{ m}$ ,  $\alpha_{TV} = 0.2 \text{ m}$

Max GW age: 21,028 yrs

Lowest dispersivity combination  
 $\alpha_{LH} = 40 \text{ m}$ ,  $\alpha_{LV} = 20 \text{ m}$ ,  $\alpha_{TH} = 4 \text{ m}$ ,  $\alpha_{TV} = 0.4 \text{ m}$

Max GW age: 11,765 yrs





## Research visit – Université Laval, Québec, Canada

- John Molson – developer of software (Saltflow)
- Professor in Hydrogeology



### Achievements of intensified cooperation:

- Further benchmarking of code for high density variations (& temperature)
- Reduction of simulation run time
- Reduction of numerical errors (oscillations for small dispersivities)
- Use of 4-component dispersivity formulation (Lichtner et al. 2002)

## Summary & Outlook - Global Sensitivity analysis

- Sensitivity analysis on DDF salt dome problem and resulting Groundwater age
- Understand effects of dispersivities
- Improving general process knowledge
  
- Conduct simulations for 4 uncertain dispersivity parameters
  - Data collection is work in progress
  - Sobol' sequence sampling in parameters space
  
- Enough data to construct PCE surrogate?
- Calculate Sobol' indices and marginal effects from PCE

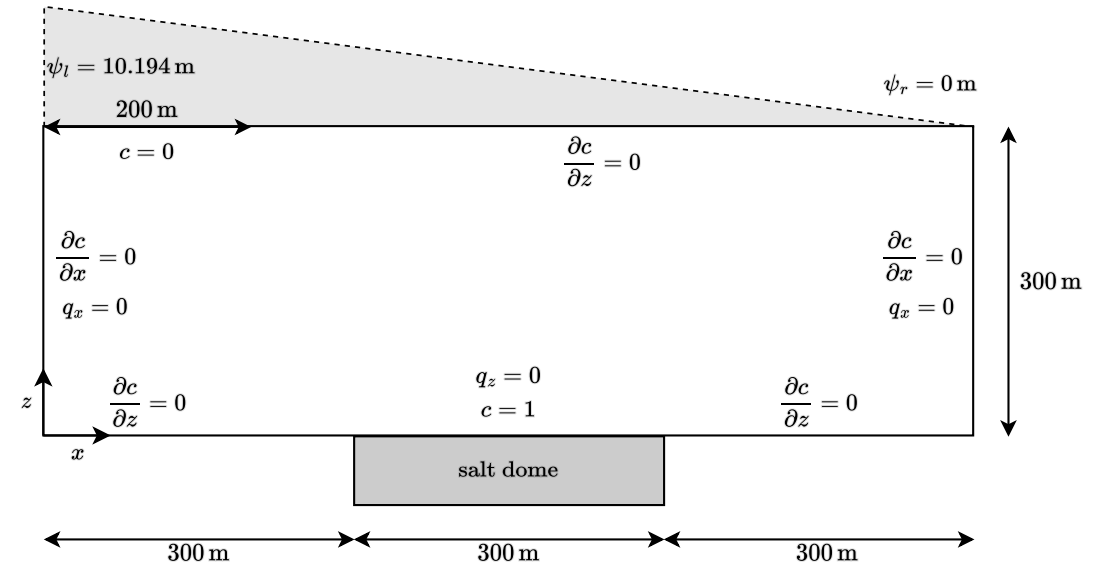
Thanks for your attention!

## Literature

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# Salt dome problem parameters

Symbol	Parameter	Value	unit
$\phi$	porosity	0.2	-
$k$	permeability	$10^{-12}$	$\text{m}^2$
$\mu$	dynamic fluid viscosity	$10^{-3}$	$\text{Pa s}$
$\rho_0$	freshwater density	1000	$\text{kg m}^{-3}$
$\rho_{max}$	maximum fluid density	1200	$\text{kg m}^{-3}$
$\gamma$	relative density coefficient	0.2	-
$g$	gravitational acceleration	9.81	$\text{m s}^{-2}$
$\alpha_L$	longitudinal dispersivity	20	$\text{m}$
$\alpha_T$	transversal dispersivity	2	$\text{m}$
$D_m$	molecular diffusion coefficient	$1.39 \cdot 10^{-8}$	$\text{m}^2 \text{s}^{-1}$
$S_s$	specific storage	0	$\text{m}^{-1}$



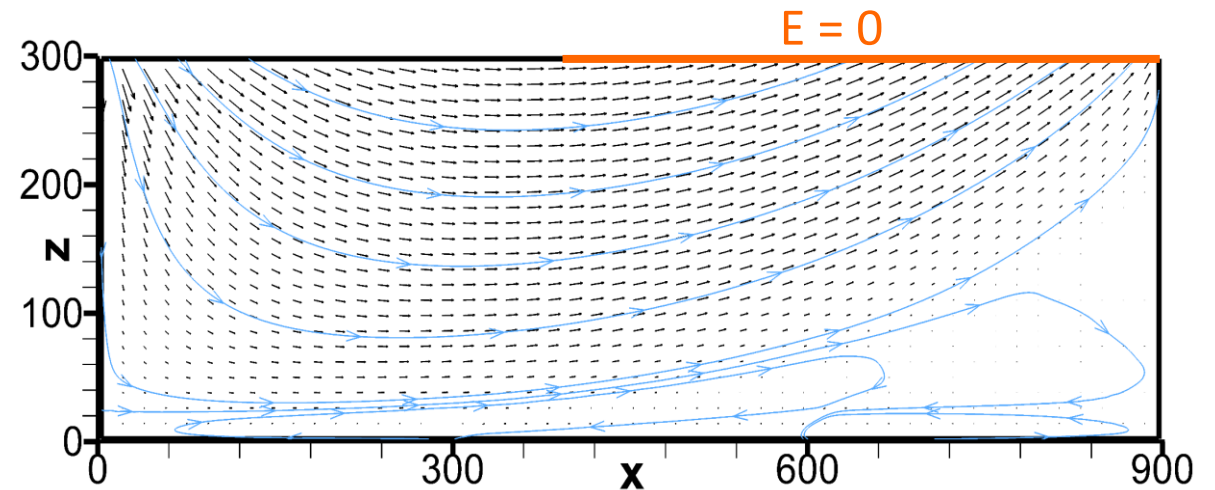
Hydr. conductivity: 
$$K_{ij} = 10^{-12} \text{ m}^2 \cdot \frac{1000 \text{ kg m}^{-3} \cdot 9.81 \text{ m s}^{-2}}{10^{-3} \text{ Pa s}} = 9.81 \cdot 10^{-6} \text{ m s}^{-1}$$

# Methods – Groundwater life expectancy simulation

Groundwater life expectancy simulation with transport equation:

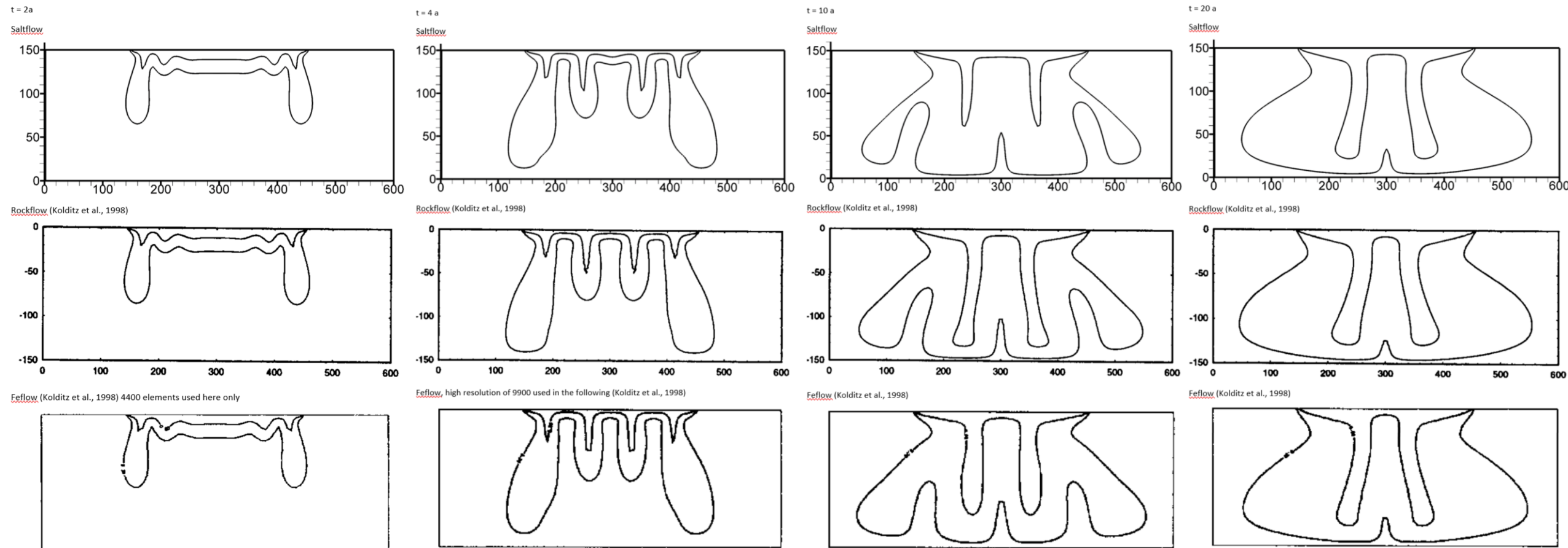
$$\frac{\partial}{\partial x_i} \left( \mathbf{D}_{ij} \frac{\partial E}{\partial x_j} \right) + \mathbf{v}_i \frac{\partial E}{\partial x_i} + 1 = 0$$

- Negative velocities as input
- BC:  $E = 0$  for outflow boundary



# Numerical Software - Benchmarking

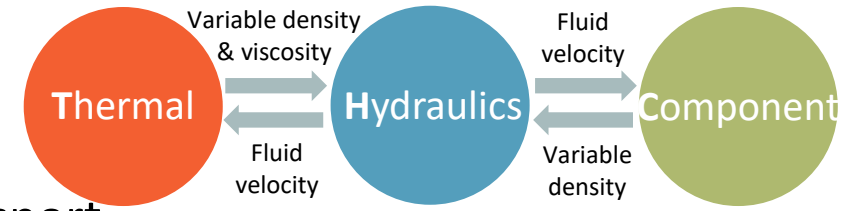
- Solutal Elder Problem (Strongly coupled DDF)





## Numerical Software

- **Heatflow smoker** (Molson & Frind 2023)
- Standard Galerkin finite element method
- Preconditioned conjugate gradient (PCG) solver for flow & transport
- second order scheme transport
- **Leismann time-weighting scheme**
- scheme leads to a symmetric positive-definite coefficient matrix that can be solved with any symmetric-matrix solve
- enabling the use of efficient symmetric matrix solvers
- unconditionally stable
- effectively second-order accurate, giving results equivalent to those obtained with the Crank-Nicolson scheme



## Numerical Software

- Heatflow smoker (Molson & Frind 2023)
- **Leismann time-weighting scheme**
- effectively second-order accurate, giving results equivalent to those obtained with the Crank-Nicolson scheme
- Advection & dispersion time weighting terms  $\theta_v, \theta_d$  are augmented with an artificial diffusion term  $\theta_a$  (that yields a symmetric transport matrix)
- $\theta_v = 0, \theta_d = 1, \theta_a = 0.5$
- Advective term is weighted on old time step, dispersive term on new time step
- Artificial diffusion term is centered in time (Crank-Nicolson)
- Nonlinearities are solved using Picard iterations with max. number or absolute convergence criterium



## Methods - Global Sensitivity analysis

- Global Sensitivity Analysis on Dispersivities
- **Variance based sensitivity analysis**
- First-order & total **Sobol' indices** ( $S_i$  &  $ST_i$ )
  - First-order: contribution of one uncertain parameter to output variance
  - Total: remaining output variance after all other uncertain parameters are known
  - Negligible interactions between parameters:  $\sum_i S_i = 1$ ,  $S_i = ST_i$ ,  $\forall i$
- Sobol' indices for characteristic single values
  - e.g. total salt mass, coordinate of specific salt conc. contour line
  - Mean/ max. Groundwater age etc.
- Marginal effects of parameters

# Methods - Global Sensitivity analysis

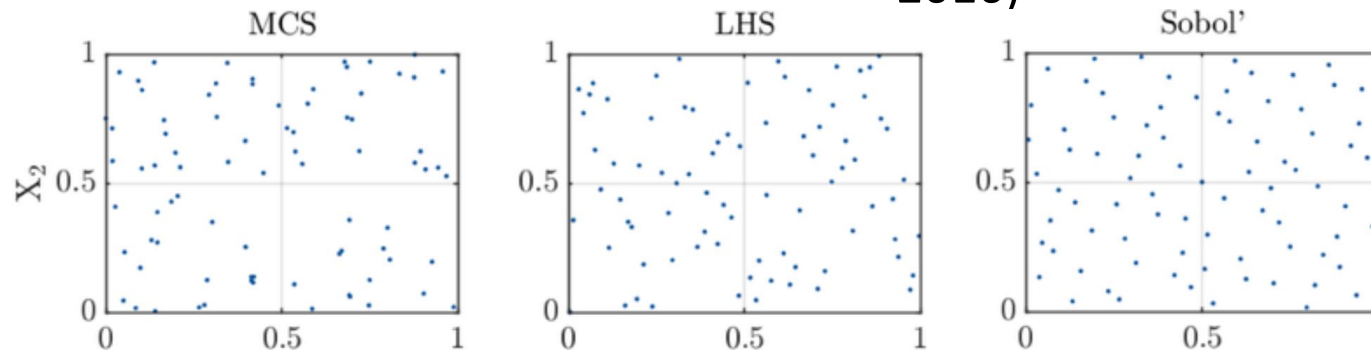
## Quasi-Monte Carlo simulations (qMCS)

- Pseudorandom sampling (e.g. Sobol' sequence, Latin Hypercube Sampling)
- Many model runs needed ( $>10^4$ ) for Sobol' indices calculation
- Total of  $N = n(k + 2)$  simulations ( $n$  – samples,  $k$  – uncertain parameters)

## Polynomial Chaos Expansion (PCE)

- **Analytical** calculation of Sobol' indices
- 2-3 o. of m. less models runs needed compared to MCS for same accuracy
- Beneficial for comp. demanding models
- Can be constructed from existing data
- Used for DDF (Younes et al. 2020 and Fahs et al. 2022) and LE (Deman et al. 2016)

Sampling strategies



Source: UQLab  
<https://www.uqlab.com/input-sampling-strategies>