## REACTIVE TRANSPORT MODELING: AN INTRODUCTION

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## Contents

- The two basic ingredients
- Example: role of mixing
- Transport with eq. Reactions
- Generalization
- Mixing and spreading
- Applications

## Ingredient 1: solute transport

- Advection:  $\mathbf{v} = \mathbf{q}/\phi$  (q proportional to K)
- Dispersion: Proportional to:  $\alpha$  q
- Reactions
- Mass Conservation

$$\phi \frac{\partial c}{\partial t} = \nabla (\mathbf{D} \nabla c) - \mathbf{q} \nabla c + f - r$$
Porosity
Dispersion
Coeff.
Water
Reactions

Written compactly  $\mathcal{L}(\mathcal{C}) = -\mathbf{q} \cdot \nabla \mathcal{C} + \nabla \cdot (\mathbf{D} \nabla \mathcal{C})$ 

#### Ingredient 2: Chemical reactions: Stoichiometric matrix

Assume a chemical system

 $\mathcal{CO}_3^{2-} = \mathcal{HCO}_3^{-} - \mathcal{H}^+$  $\mathcal{CO}_2 = \mathcal{HCO}_3^- + \mathcal{H}^+ - \mathcal{H}_2\mathcal{O}$  $\mathcal{C}a^{2+} = \mathcal{C}a\mathcal{C}O_{3^{c}} + \mathcal{H}^{+} - \mathcal{H}\mathcal{C}O_{3}^{-}$ 

Let  $r_i$  be the number of moles of reactants that evolve into products for the i-th reaction

• Stoichiometric Matrix (rows: reactions; columns: species)



each species

Reaction rate: Mass balance

$$R = S^{t}r$$

#### **Reactive transport**

Reactions

 $\begin{array}{l}
 r_1 \quad CO_3^{2-} = HCO_3^{-}(-H^+) \\
 r_2 \quad CO_2 = HCO_3^{-}(+H^+) - H_2O \\
 r_3 \quad Ca^{2+} = CaCO_{3s}(+H^+) - HCO_3^{-}
 \end{array}$ 

Let  $r_i$  be the number of moles of reactants that evolve into products for the i-th reaction

- Transport of all species
- $\phi \frac{\partial \mathcal{H}^{+}}{\partial t} = \mathcal{L}(\mathcal{H}^{+}) r_{1} + r_{2} + r_{3} \qquad \phi \frac{\partial \mathcal{H}\mathcal{C}\mathcal{O}_{3}^{-}}{\partial t} = \mathcal{L}(\mathcal{H}\mathcal{C}\mathcal{O}_{3}^{-}) + r_{1} + r_{2} r_{3}$   $\phi \frac{\partial \mathcal{C}\mathcal{O}_{3}^{2-}}{\partial t} = \mathcal{L}(\mathcal{C}\mathcal{O}_{3}^{2-}) r_{1} \qquad \phi \frac{\partial \mathcal{C}\mathcal{O}_{2}}{\partial t} = \mathcal{L}(\mathcal{C}\mathcal{O}_{2}) r_{2} \qquad \phi \frac{\partial \mathcal{C}a^{2+}}{\partial t} = \mathcal{L}(\mathcal{C}a^{2+}) r_{3}$ 
  - Recall S  $\mathbf{S} = \begin{pmatrix} H^{+} & HCO_{3}^{-} & CO_{2} & Ca^{2+} & CaCO_{3s} & H_{2}O \\ 1 & 1 & -1 & 0 & 0 & 0 \\ 1 & -1 & 0 & -1 & 0 & 0 & -1 \\ 1 & -1 & 0 & 0 & -1 & 1 & 0 \end{pmatrix}$ Primary Secondary Constant Ac.

$$\frac{\partial \mathbf{c}}{\partial t} = \mathbf{M} \mathcal{L}(\mathbf{c}) + \mathbf{S}_{\mathbf{e}}^{\dagger} \mathbf{r}_{\mathbf{e}} + \mathbf{S}_{\mathbf{k}}^{\dagger} \mathbf{r}_{\mathbf{k}}(\mathbf{c}) \quad n_{s} \text{ transport equations}$$

$$S_{ea} \log c_a = \log K$$
  

$$r_k = r_k(c)$$

$$n_r \text{ algebraic equations}$$

Looks awful! ( $n_r + n_s$  unknowns at every point) Seek tricks and/or simplifications

## So... objectives of this presentation

- Is reactive transport needed?
- Can be understood?
- Can be solved efficiently?
  - ... and the answer is YES
- Do we really know how to do it? ... not quite... but getting there

#### Why worry reactive transport? Ex: Karst development in coastal areas



#### Calcite dissolution in coastal aqf.

Mixture of two calcite saturated waters may be under or oversaturated with respect to calcite



Salinity



## SI & r



## Speciation



Dissolution causes diffusion of  $CO_2$  (acidity) at the freshwater end, which drives further dissolution

## Sensitivity to $CO_2$



Reducing concentration of  $CO_2$  at the freshwater end, causes an increase in subsaturation. Therefore, one would expect an increase in dissolution rate

## However, dissolution rate is dramatically reduced

## First conclusion

The interplay between transport and reactions is non-trivial.

- Saturation index calculations are needed but they fail to indicate
- 1) how much calcite is dissolved, which is controlled by mixing rate,
- 2) nor where (or under which conditions) dissolution rate is maximum.

Simulating reactive transport is needed to understand the fate of reacting solutes!

## Still, isn't it too difficult?

- Yes, if using brute force
- However, a number of "tricks" are possible, depending on the type of chemical system
  - If all reactions in equilibrium (Desimoni et al, 2005)
  - If also kinetic reactions (Molins et al, 2007)
  - In general (Saaltink et al, 1998)

#### The basic trick: components

$$\frac{\partial \mathbf{c}}{\partial t} = \mathbf{M} \mathcal{L}(\mathbf{c}) + \mathbf{S}_{e}^{t} \mathbf{r}_{e} + \mathbf{S}_{k}^{t} \mathbf{r}_{k}(\mathbf{c})$$

Choose component matrix U, such that

$$\mathsf{US}_{e}^{\dagger}=0 \Rightarrow \mathsf{US}_{e}^{\dagger}\mathsf{r}_{e}=0$$

Then,

$$\mathbf{U}\frac{\partial \mathbf{c}}{\partial t} = \mathbf{U}\mathbf{M}\mathcal{L}(\mathbf{c}) + \mathbf{U}\mathbf{S}_{\mathbf{k}}^{\dagger}\mathbf{r}_{\mathbf{k}}(\mathbf{c})$$

Components:  $\mathbf{u} = \mathbf{U}\mathbf{c}$ 

Linear combinations of species that remain unaltered by equilibrium reactions

 $n_s - n_r$  transport equations.

(A good choice of U allows these equations to be decoupled!)

### Example

- Chemical system  $CO_3^{2-} = HCO_3^{-} H^+$   $CO_2 = HCO_3^{-} + H^+ - H_2O$   $Ca^{2+} = CaCO_{3s} + H^+ - HCO_3^{-}$ • Stoichiometric Matrix  $\left(H^+ HCO_3^{-} \mid CO_3^{2-} CO_2 Ca^{2+}\right)^{-1}$ 
  - $\mathbf{S}_{e} = (\mathbf{S}_{1}; -\mathbf{I}) \qquad \mathbf{S}_{e} = \begin{vmatrix} 77 & 7760_{3} & 60_{3} & 60_{2} & 60_{3} \\ -1 & 1 & -1 & 0 & 0 \\ 1 & 1 & 0 & -1 & 0 \\ 1 & -1 & 0 & 0 & -1 \end{vmatrix}$
- Components matrix  $S_e = (I; S_1^+)$  $U = \begin{pmatrix} H^+ & HCO_3^- & CO_2 & Ca^{2+} \\ 1 & 0 & -1 & 1 & 1 \\ 0 & 1 & 1 & 1 & -1 \end{pmatrix}$
- Components  $u_1 = H^+ - CO_3^{2-} + CO_2 + Ca^{2+}$  (acidity)  $u_2 = HCO_3^- + CO_3^{2-} + CO_2 - Ca^{2+}$  (Total Inorganic Carbon)

#### Role of components

$$\phi \frac{\partial \mathcal{H}^{+}}{\partial t} = \mathcal{L}(\mathcal{H}^{+}) - r_{1} + r_{2} + r_{3}$$

$$\phi \frac{\partial \mathcal{H}CO_{3}^{-}}{\partial t} = \mathcal{L}(\mathcal{H}CO_{3}^{-}) + r_{1} + r_{2} - r_{3}$$

$$\phi \frac{\partial \mathcal{C}O_{3}^{2-}}{\partial t} = \mathcal{L}(\mathcal{C}O_{3}^{2-}) - r_{1}$$

$$\phi \frac{\partial \mathcal{C}O_{2}}{\partial t} = \mathcal{L}(\mathcal{C}O_{2}) - r_{2}$$

$$\phi \frac{\partial \mathcal{C}a^{2+}}{\partial t} = \mathcal{L}(\mathcal{C}a^{2+}) - r_{3}$$

$$u_{1} = \mathcal{H}^{+} - \mathcal{C}O_{3}^{2-} + \mathcal{C}O_{2} + \mathcal{C}a^{2+}$$

$$u_{2} = \mathcal{H}CO_{3}^{-} + \mathcal{C}O_{3}^{2-} + \mathcal{C}O_{2} - \mathcal{C}a^{2+}$$

Components are linear combinations of species such that equilibrium r's cancel out, so that  $\phi \frac{\partial u_1}{\partial t} = \mathcal{L}(u_1)$ 

 $\mathbf{U} = \begin{pmatrix} \mathcal{H}^{+} & \mathcal{HCO}_{3}^{-} & \mathcal{CO}_{3}^{2-} & \mathcal{CO}_{2} & \mathcal{Ca}^{2+} \\ 1 & 0 & -1 & 1 & 1 \\ 0 & 1 & 1 & 1 & -1 \end{pmatrix}$ 

## Procedure

- 1. Define chemical system and components
- 2. Solve transport equations for components (and/or primary species)
- **3.** Speciation: Compute species concentrations from components (and/or primary species)
- 4. Substitute species back into transport equations to obtain reaction rates

## Analytical solution for 2 species

Assume 2 species (e.g.  $SO_4^{2-}$  and  $Ca^{2+}$ ) in eq. with gypsum Step 1: Chemical system Reaction  $Ca^{2+} + SO_4^{2-} \square CaSO_{4s} \Rightarrow \lceil Ca^{2+} \rceil \cdot \lceil SO_4^{2-} \rceil = K$ Stoichiometric matrix  $S_e = (-1 \ -1 \ 1)$ Components:  $U = (1 - 1) \Rightarrow u = \lceil Ca^{2+} \rceil - \lceil SO_4^{2-} \rceil$  is conservative! Step 2: Solve transport of u Transport equations  $\frac{\partial (\phi C_1)}{\partial t} - \mathcal{L}(C_1) = -r \quad (1)$  $\frac{\partial (\phi C_2)}{\partial t} - \mathcal{L}(C_2) = -r \quad (2)$ where  $\mathcal{L}(c) = -\mathbf{q} \cdot \nabla c + \nabla \cdot (\mathbf{D} \nabla c)$ (1)-(2) yields:  $\frac{\partial(\phi u)}{\partial t} = \mathcal{L}(u)$ 

### Analytical solution for 2 species



Step 4: Compute r Plugging  $C_2$  into  $\frac{\partial(\phi C_2)}{\partial t} - \mathcal{L}_t(C_2) = -r$   $\mathcal{L}_t(c) = -\mathbf{q} \cdot \nabla c + \nabla \cdot (\mathbf{D} \nabla c)$ Transport We obtain  $r = \frac{\partial^2 C_2}{\partial u^2} [\nabla u^T \cdot \mathbf{D} \cdot \nabla u]$ Chemistry  $\frac{\partial^2 C_2}{\partial u^2} = \frac{2K}{(u^2 + 4K)^{3/2}}$ 

#### Solution of binary system for pulse input



#### Spatial distribution of reaction rate



#### Spatial distribution of total precipitate



#### 2nd Conclusion

#### In the case of aqueous and dissolutionprecipitation reactions in equilibrium:

- 1. Reactive Transport is indeed easy!
- Only need to solve for independent components. In the calcite example:2 components are needed (+salinity)... Actually, one will suffice by working with mixing ratios... (Desimoni et al., 2007)

#### 3. Mixing drives fast reactions

#### But do we know how to simulate mixing?

 Traditionally, mixing is simulated by means of dispersion.

#### Dispersion

Traditionally defined from integrated breakthrough curves, measures spreading

Mixing controls reactions



#### Spreading and Mixing

Spreading  $\rightarrow$  extension  $\rightarrow$  it's observed in tracer tests

Mixing

Spreading

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Mixing \rightarrow dilution \rightarrow controls reactions
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They are equated in conventional ADE

#### Effect on data



## Alternatives to ADE: MRMT, memory functions, CTRW, FDE,... (non-local)

View medium as consisting 
$$\phi_f$$
 of two parts: mobile (f)  $\phi_f$  and immobile (im)

$$\phi_f \frac{\partial c_f}{\partial t} = \nabla \cdot \left( \mathcal{D}_f \cdot \nabla c_f \right) - q \cdot \nabla c_f + F_{im}$$

F<sub>im</sub>: Exchange between f and im, given by

$$F_{im} = g * \frac{\partial c_f}{\partial t}$$

g: memory function, concept imported from leaky aquifer modelling (Herrera): can be viewed as

- Flux in response to unit change at boundary
- Residence time distribution in immobile region

Berkowitz, Dentz, Haggerty, Benson, LeBorgne... <sup>3rd</sup> Kaplan Work and a long etc, including yours truly

#### Physical and Numerical representation



3<sup>rd</sup> Kaplan Workshop, 2010, Israel

This can be represented in two ways:

- 1) Having an appropriate mesh with nodes representing i
- Eliminating i as an explicit unknown (expressing c<sub>i</sub> as a function of c)

Mobile region transport (Diff)

Mobile region transport (ADE)

Mobile region transport (Diff)

(Silva et al, 2009)

## Non local formulations work for conservative transport



# Testing the approach on simulated heterogeneous medium: two steps

#### Conservative transport characterization

- 1) Generate heterogeneous medium
- 2) Simulate conservative transport
- 3) Compute BTC's
- 4) Find memory function (Willmann et al, 2008)

#### Reactive transport simulation

- 1) Simulate reactive transport of binary system with an equilibrium dissolution precipitation reaction **on the heterogeneous medium**
- 2) Simulate reactive transport using above memory function and proposed approach
- 3) Compare (Willmann et al, 2010)

#### Generate heterogeneous medium



#### Simulate transport





#### Results reactive - transport: 2D simulations: Reaction rates



#### component u



#### Results - reactive transport: Reaction rates

#### Comparison between heterogeneous and MRMT model







#### Results - reactive transport: Total precipitated mass



## 3<sup>rd</sup> (and final) conclusion

- We do not really know how to simulate mixing, but spreading
- Non-local models separate mixing and spreading
- Their parameters can be linked to the underlying heterogeneity.
- Excellent agreement between 2D heterogeneous and 1D MRMT solutions in terms of total precipitated mass.

#### Salinization by Evaporation Initially water saturated (low $MgSO_4$ conc)



3<sup>rd</sup> Kaplan Workshop, 2010, Israel

(Gran et al, submitted)

#### CONCEPTUAL AND NUMERICAL MODELING



1D model coupling multiphase flow & reactive transport using CodeBrightRetraso code Saaltink et al (2004). Chemistry with CHEPROO (Bea et al, 2010).

### Model results (line) and measurements (dots)



### Results: Water flux



### Results: Water flux



# Similar experiments acid generation from mine tailings





# Water isotopes confirm condensation below



#### Types of behaviour of solutes





## Summary

- Is Reactive transport needed?
  - Equilibrium reactions (rate , where, when, under which conditions) are controlled by transport.
  - Applications probably required to help understand complex interactions
- Can it be understood?
  - All it takes is to understand components
  - The difficult part is to choose the relevant species and reactions.
- Can be solved efficiently?
  - Yes, very often (but not always!)

Reactions are driven by **disequilibrium** Disequilibrium is driven by **actual mixing** We need to know how to evaluate actual mixing!

We are working on it!