



Simulation of Reverse Osmosis Membrane Compaction using Material Point Method

SIAM Conference on Computational Science and Engineering (CSE2023), Amsterdam

Presenter:

Dr. Sreejith N. A. Researcher National Renewable Energy Laboratory (NREL), Golden, Colorado, USA Date: March. 3rd, 2023 Other Contributors: Dr. Hariswaran Sitaraman Dr. Marc Day Dr. Yara Suleiman Prof. Sina Shabazmohamadi Dr. Jishan Wu Prof. Eric Hoek

NREL NREL University of Connecticut University of Connecticut University of Los Angeles University of Los Angeles

Contents

- Background
- Exagoop MPM Solver
- Application to RO membrane compaction problem





Background



National Alliance for Water Innovation



2

Now

Introduction



Global regions with water shortage in 1901-1910¹



Global regions with water shortage in 2001-2010¹



1. <u>https://waterscarcityatlas.org/water-shortage/</u>, Data: Kummu et.al., Nature SR, 2016

2. <u>http://www.globalpollutionmap.org/sites.html</u>, Data: Pure Earth TSIP



Regions with water contaminated by heavy metals²

- 1.2 billion people across the world live in regions of water scarcity
- 2 million tons of industrial, sewage and agriculture waste discharged worldwide every day
- 14000 people die every day due to health reasons arising from drinking unhealthy water
- 140 million people regularly drink water with contaminants more than WHO provided guidelines



Introduction



Prominent ZLD Processes



Thermal Brine Concentrator Consumption (kWh m⁻³) 80 Specific Energy 60 40 -Conventional RO ∆P_{max}= 80 bar HPRO 20 **HPRO** •_{max}= 300 bar ΔP С 50 100 150 200 250 0 Feed Concentration (g L⁻¹)



Typical HPRO Membrane structure*



Introduction

HPRO Membrane Compaction





Pristine Membrane (SEM image)



Compacted Membrane (SEM)

- Compaction arises from hydraulic pressure from feed water acting on membrane surface
- Alters the porous structure of the membrane
- Compacted membranes reduces permeate, increases pressure required for same flux and hence increases operating cost

Numerical Method?

MPM!



National Alliance for Water Innovation

Material Point Method (MPM)

Governing equations

$$\rho \frac{Dv}{Dt} = \rho \boldsymbol{b} + \nabla \boldsymbol{.} \boldsymbol{\sigma}$$

 $\boldsymbol{\sigma} = \boldsymbol{\sigma}(\boldsymbol{D}, \boldsymbol{E}, \boldsymbol{\nu})$

 $\boldsymbol{D} = \frac{1}{2}(\boldsymbol{L} + \boldsymbol{L}^T)$

 $L = \nabla v$

 $\rho \rightarrow density$ $\nu \rightarrow velocity$ $\sigma \rightarrow stress$ $b \rightarrow body force$ $E \rightarrow youngs modulus$ $\nu \rightarrow poisson's ratio$

- For isothermal problems, energy equation is not solved
- Mass conservation equation implicitly satisfied



- MPM is a variant of PIC method
 - Material represented as a collection of "particles"/"material points"
 - All material properties defined at "particles"
 - Density field $ho = \sum m_i \delta(x x_i)$
- Advantages compared to regular FEM
 - No unstructured and deforming grids
 - Can handle large deformations
 - Flexibility with constitutive models
 - Complex geometries
 - Amenable to large-scale computing



Exagoop MPM Solver



National Alliance for Water Innovation

March 3, 2023

Material Point Method (MPM)



- MPM Solver Developed at NREL: *Exagoop*¹
- Exagoop is developed based on AMReX² Framework
- Block-structured grid framework--> Used as background grid
- Embedded boundary method used to model complex geometry
- Particle class in AMReX used to model material point related operations
- Parallel capability → On CPUs and GPUs



- 1. https://github.com/NREL/Exagoop
- 2. <u>https://github.com/AMReX-Codes/amrex</u>

National Alliance for Water Innovation

Test Case 1: Dam break

Experimental Configuration:



$$L_0 = 0.1 m$$
 $\rho = 997 kg/m^3$
 $H_0 = 0.2 m$ $\mu = 0.001 Nm/s$





Test Case 1: Dam break





1. "An experimental study of the collapse of liquid columns on a rigid horizontal plane", Martin & Moyce, 1952, Philosophical Transactions of the Royal Society of London

Test Case 2: Elastic Collision of Disks

Problem Definition:



Domain size: 2m x 2m Background grid: 40 x 40 Constitutive Model: Linear Elastic Number of material points: 416 Shape Functions: Linear hat, Quadratic B-Spline, Cubic B-Spline CFL number =0.1 Number of particles per cell = 4



MPM Model:

Test Case 2: Elastic Collision of Disks







Cubic B-Spline

Disks collision colored by contours of stress, σ_{xx}

Evolution of energy with time



Full recovery of total energy observed for all shape functions

National Alliance for Water Innovation

Application to RO membranes



National Alliance for Water Innovation



Application to simulation of RO membrane compaction





MPM Model:

SEM image of uncompacted membrane cross-section



Fine porous structures

Macro voids



Image converted to material point collection using python script



Domain size: 100um x 60um Number of material points: 180K **Constitutive Model: Linear Elastic** Shape Function: Linear Hat CFL = 0.1



National Alliance for Water Innovation

Application to simulation of RO membrane compaction





Compacted membrane



Application to simulation of RO membrane compaction



Comparison of membrane heights observed in experiments and MPM



Normal stress contours at material points



National Alliance for Water Innovation

March 3, 2023

Conclusions

- Material point method-based solver used to simulate RO membrane compaction
- MPM solver- Exagoop developed based on the AMReX framework
- Exagoop solver validated and verified with canonical test cases and shows excellent match with available solutions
- Higher order shape functions are costlier when compared to linear hat shape functions. However, cubic B-spline function exhibits maximum accuracy
- Application of MPM to membrane compaction problem shows good qualitative and visual match with macro void structure observed from SEM images
- MPM predicts membrane deformation within an accuracy of 16% when compared to experiments



Other researchers who contributed to this project





Dr. Hariswaran Sitaraman



Jishan Wu (UCLA)



Yara Suleiman (UConn)



Dr. Marc Day (NREL)



Prof. Eric Hoek (UCLA)



Prof. Sina Shabazmohammadi (UConn)



National Alliance for Water Innovation

THANK YOU

NREL/PR-2C00-85437

This work was authored in part by the National Renewable Energy Laboratory, operated by Alliance for Sustainable Energy, LLC, for the U.S. Department of Energy (DOE) under Contract No. DE-AC36-08GO28308. Funding provided by U.S. Department of Energy Office of Science and National Nuclear Security Administration. The views expressed in the article do not necessarily represent the views of the DOE or the U.S. Government. The U.S. Government retains and the publisher, by accepting the article for publication, acknowledges that the U.S. Government retains a nonexclusive, paid-up, irrevocable, worldwide license to publish or reproduce the published form of this work, or allow others to do so, for U.S. Government purposes. This research was supported by the NAWI UHPRO project, a collaborative effort of the U.S. Department of Energy Office of Science and the National Nuclear Security Administration. A portion of the research was performed using computational resources sponsored by the Department of Energy's Office of Energy Efficiency and Renewable Energy and located at the National Renewable Energy Laboratory.





National Alliance for Water Innovation

APPENDIX

National Alliance for Water Innovation

March 3,

20

Now

Test Case 1: Axial vibration of bar

Problem Definition



Governing Equations, Boundary conditions, Initial Conditions

Governing Equation

$$\frac{\partial^2 u}{\partial t^2} = c^2 \frac{\partial^2 u}{\partial x^2}, \qquad 0 \le x \le L$$

 $u(0,t) = 0 \quad \frac{\partial u}{\partial x}(L,t) = 0$

u(x,0) = 0 $\frac{\partial u}{\partial t}(x,0) = V_0 \sin(\frac{\pi x}{2L})$

 $u(x,t) = V_0/\omega_1 \sin\left(\frac{\pi x}{2L}\right) \sin(\omega_1 t)$

Boundary Conditions

Initial Conditions

Exact Solution





Number of cells in background grid = 29 x 3 L = 25 Number of particles per cell = 1 Shape Functions: Linear hat, Quadratic B-Spline, Cubic B-Spline Constitutive Model: Linear Elastic Courant-Friedrichs-Lewy (CFL) number = 0.1

Test Case 1: Axial vibration of bar



Excellent match with exact solution, Excellent conservation of total energy

National Alliance for Water Innovation



Material Point Method (MPM)

1. Particle to Node





2. Nodal velocity update

Step 0 • Initialize particle positions, m_p , v_p and σ_p Step 1 • $m_I^t = \sum_p \phi_I(x_p^t)m_p$ • $(mv)_I^t = \sum_p \phi_I(x_p^t)(mv)_p^t$ • $f_I^{\{ext,t\}} = \sum_p \phi_I(x_p)m_pb(x_p)$ • $f_I^{\{int,t\}} = -\sum_p V_p^t \sigma_p^t \nabla \phi_I(x_p^t)$



Step 3 $\circ \quad v_p^{\{t+\Delta t\}} = \alpha \{ v_p^t + \sum_I \phi_I (x_p^t) \left[\Delta v_I^{\{t+\Delta t\}} \right] \} + (1 - \alpha) \sum_I \phi_I (x_p^t) \left[v_I^{\{t+\Delta t\}} \right]$

Step 4 $\circ \quad x_p^{\{t+\Delta t\}} = x_p^t + \Delta t \ \sum_I \phi_I(x_p^t) v_I^{\{t+\Delta t\}}$



National Alliance for Water Innovation