

# The Particle-In-Cell Method For Simulating Incompressible Fluids

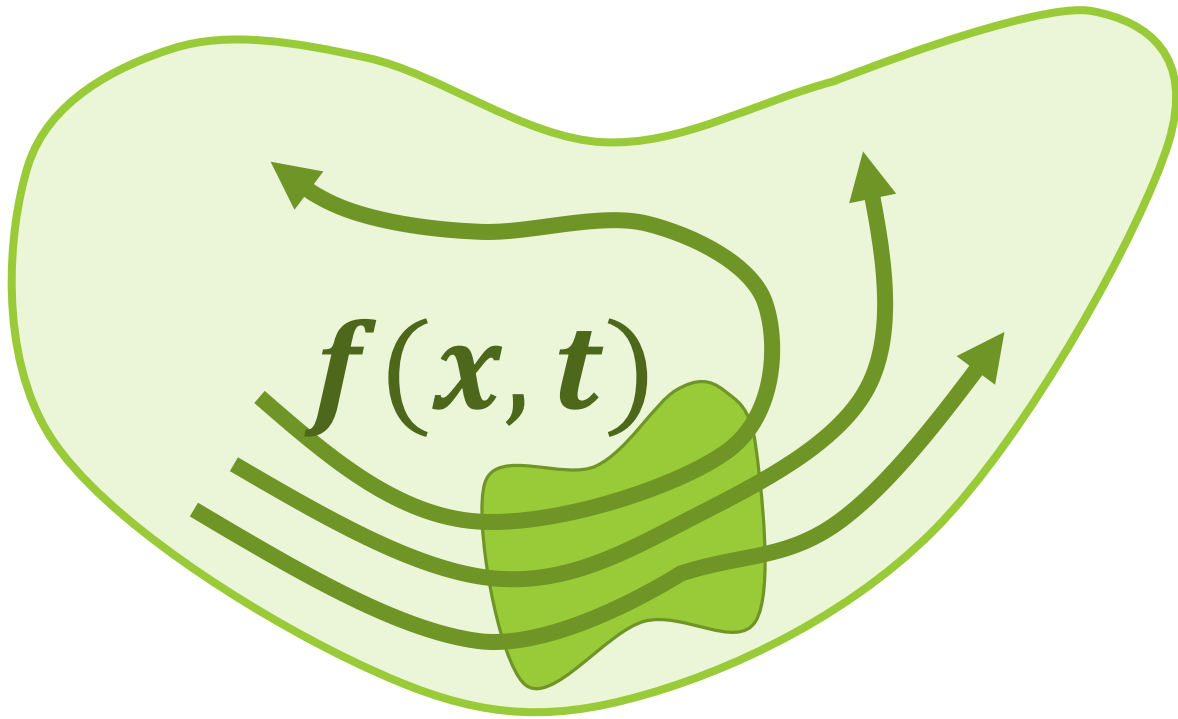
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CS 888 Final Project

Jonathan Panuelos

# Motivation

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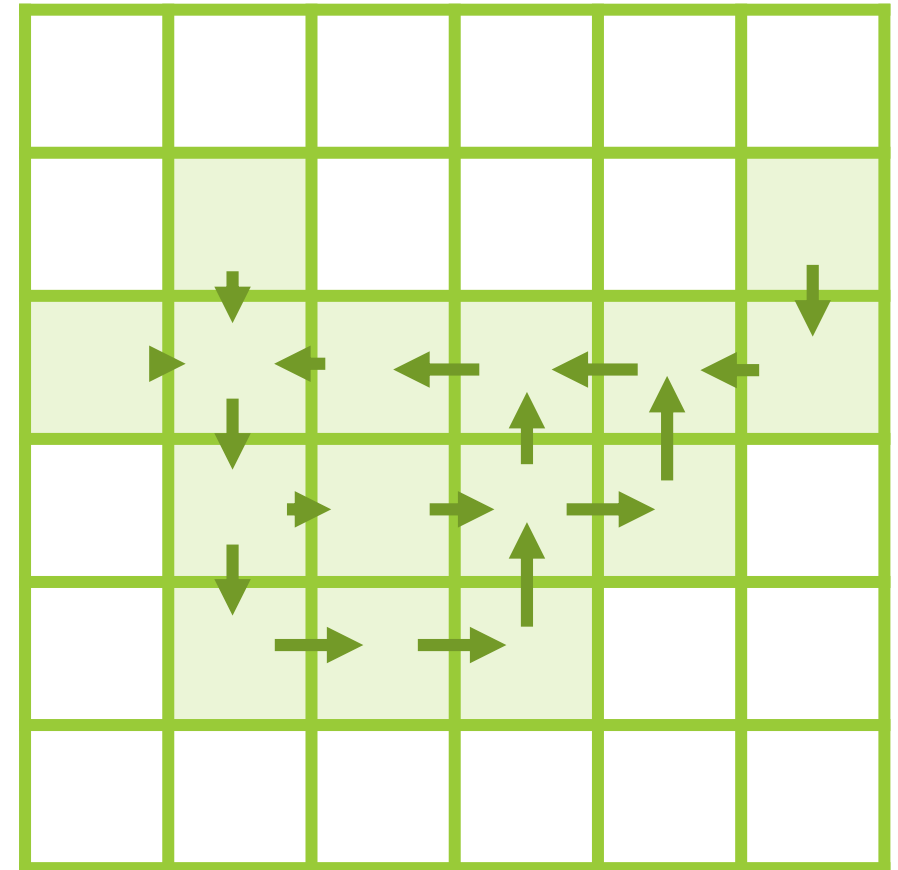
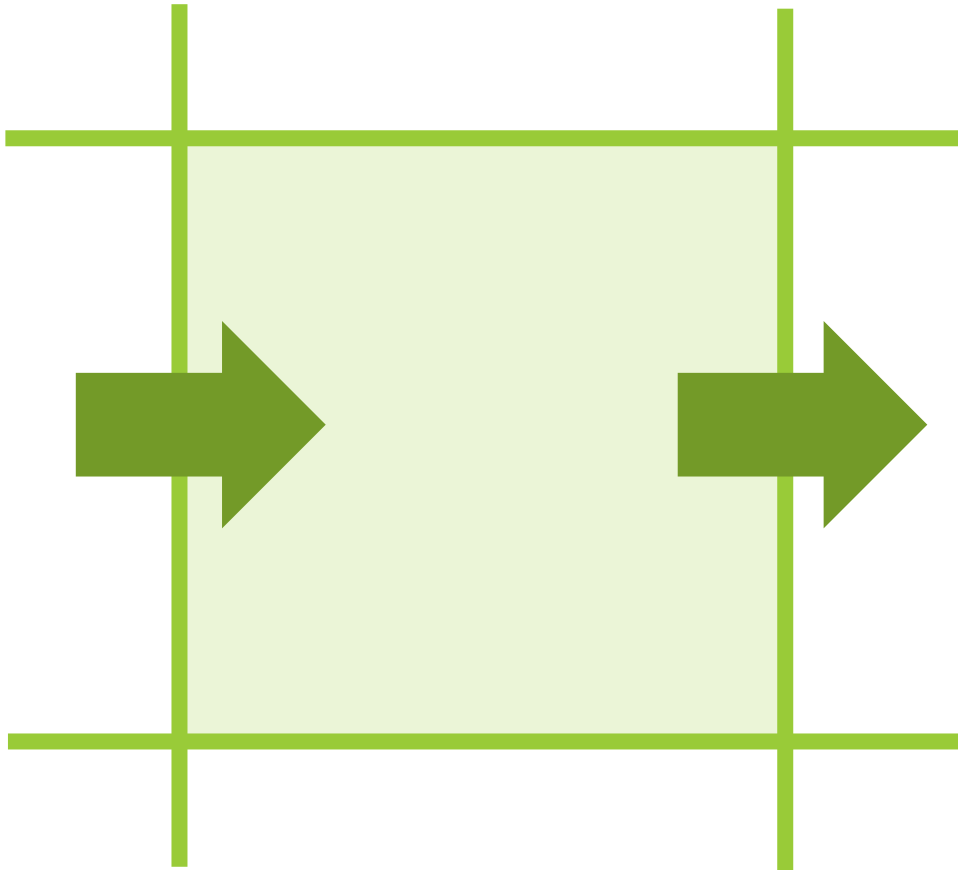


We want to simulate natural phenomena realistically in graphics

Can use conservation laws and enforce constraints such as incompressibility

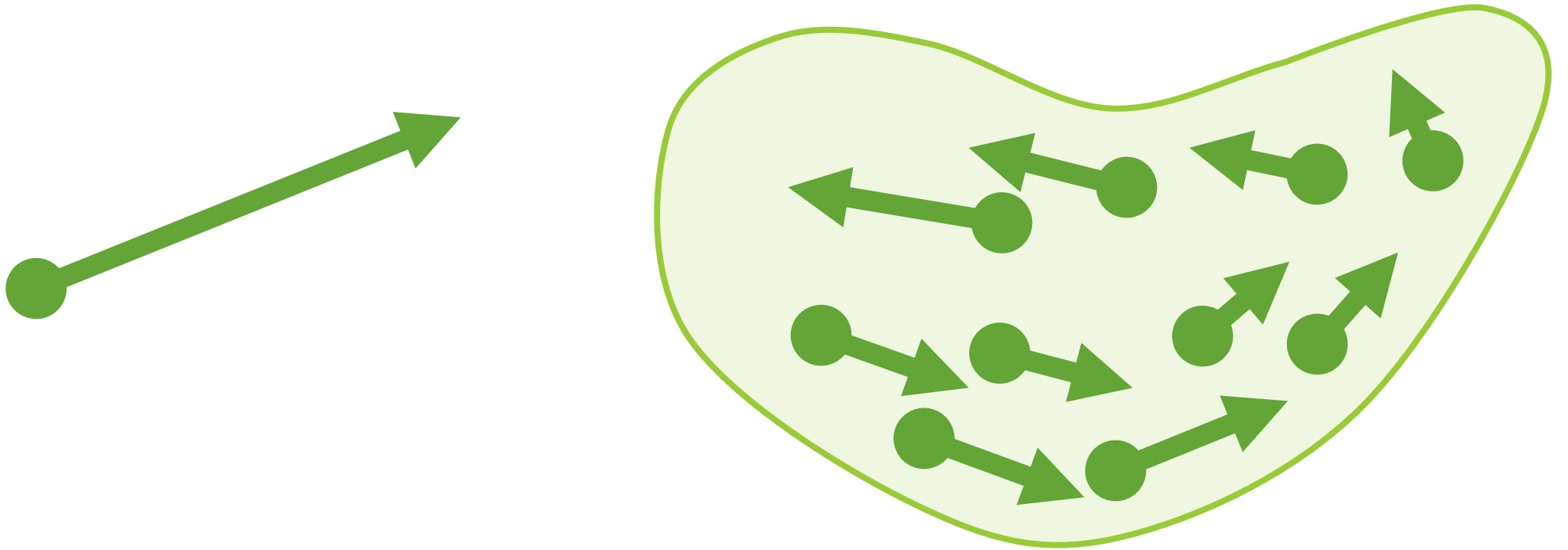
# Eulerian Simulation

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# Lagrangian Simulation

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# Eulerian vs Lagrangian

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## Eulerian

Speed

Definite Neighbours

Easy FD Approximations

## Lagrangian

Easy Advection

Free Momentum  
Conservation

# The Particle-In-Cell Method

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Advect fluid using particles

Use grid to evolve velocity

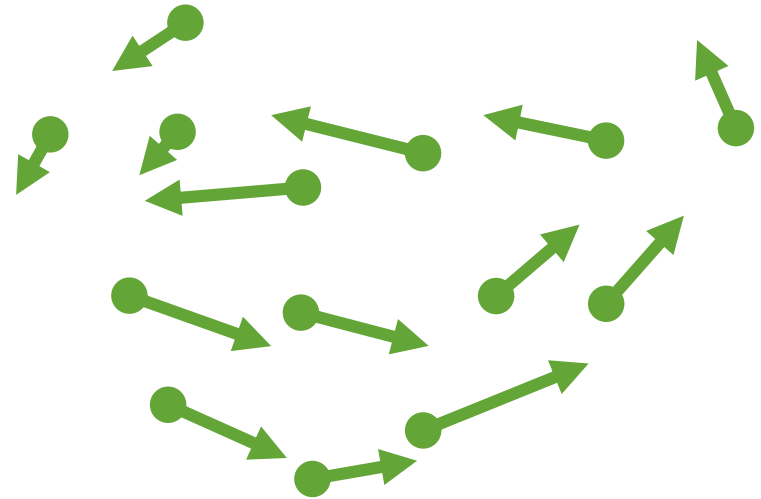
- Enforcing divergence-free velocities

My implementation largely based on *Animating Sand as a Fluid* (Zhu & Bridson 2005), *Fluid Simulation for Computer Graphics* (Bridson Textbook)

# The Particle-In-Cell Method

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Start with particles holding velocities

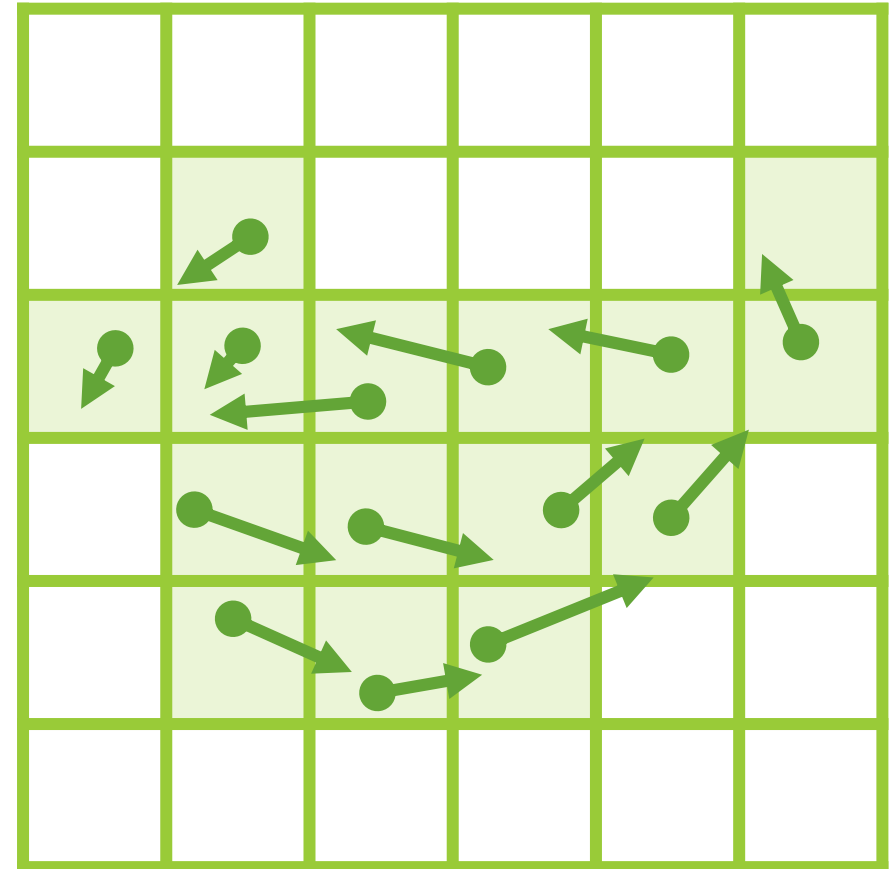


# The Particle-In-Cell Method

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Start with particles holding velocities

Overlay a background grid





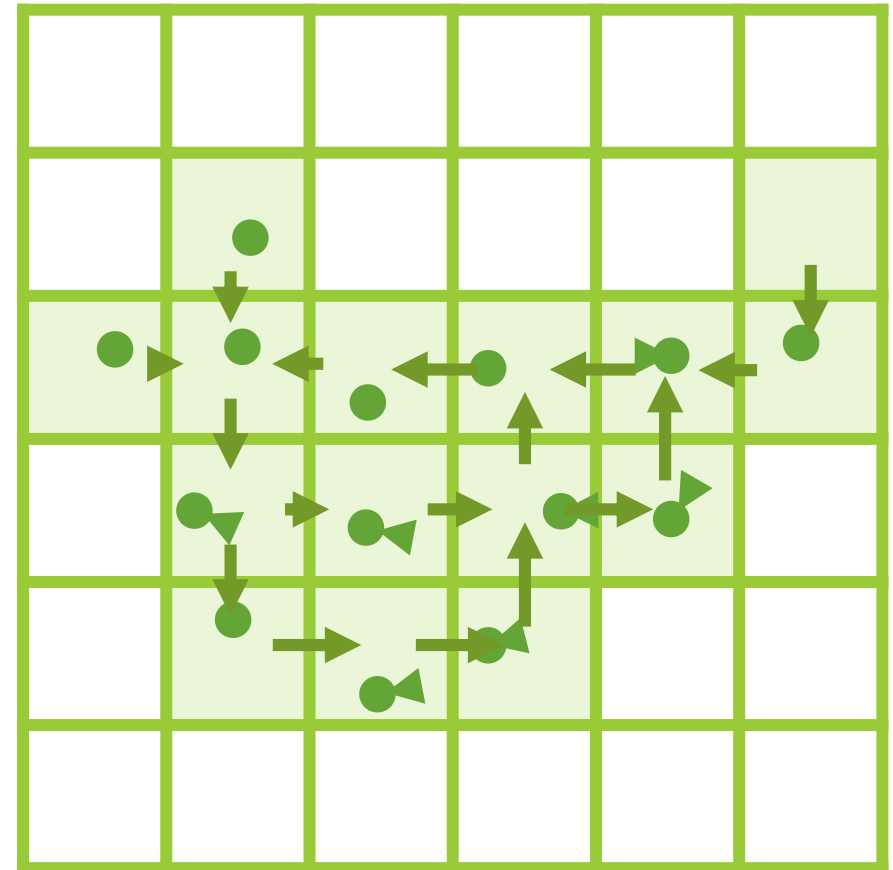
# The Particle-In-Cell Method

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Start with particles holding velocities

Overlay a background grid

Transfer velocities to background grid



# The Particle-In-Cell Method

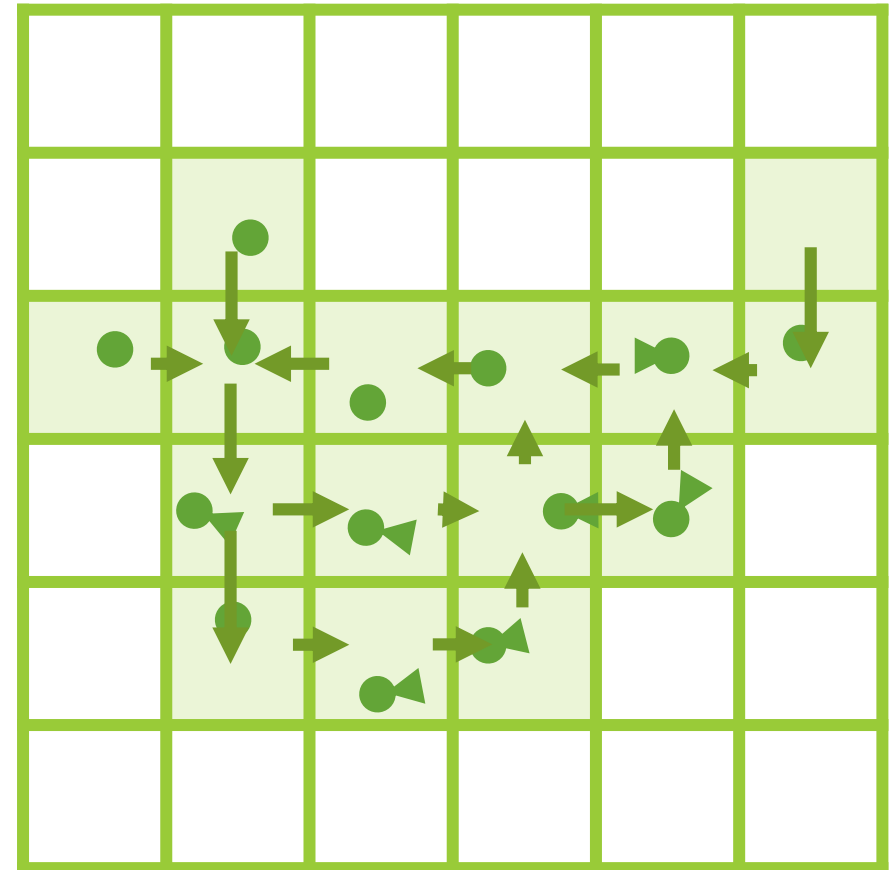
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Start with particles holding velocities

Overlay a background grid

Transfer velocities to background grid

Evolve velocities on the grid



# The Particle-In-Cell Method

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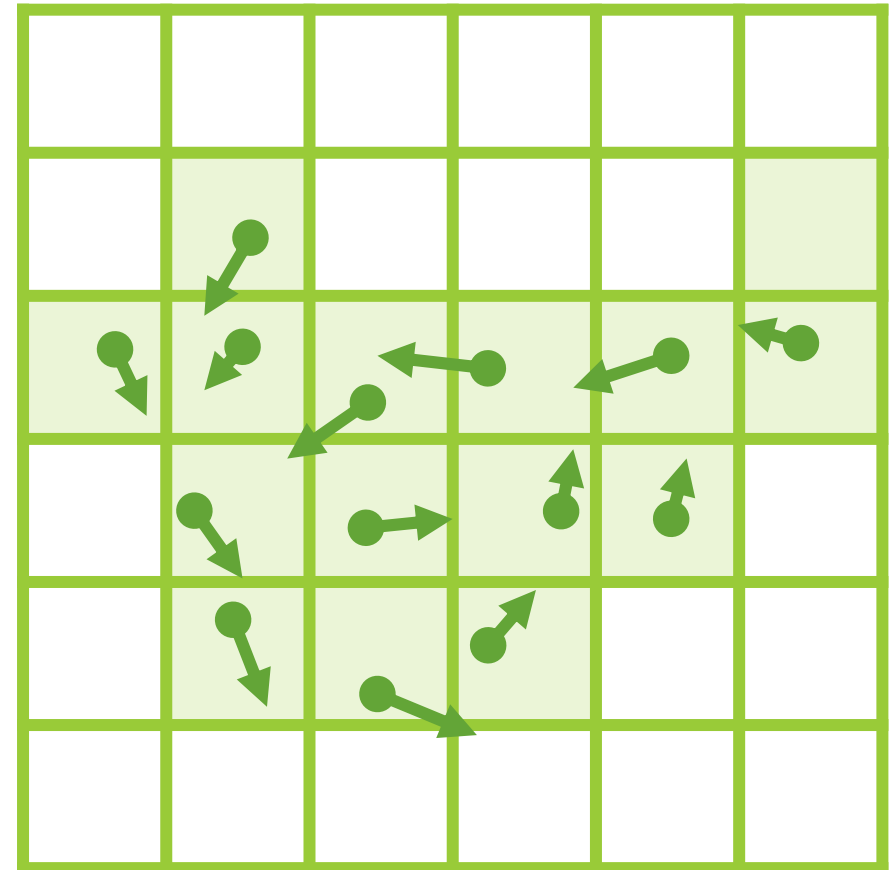
Start with particles holding velocities

Overlay a background grid

Transfer velocities to background grid

Evolve velocities on the grid

Transfer velocities to particles



# The Particle-In-Cell Method

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Start with particles holding velocities

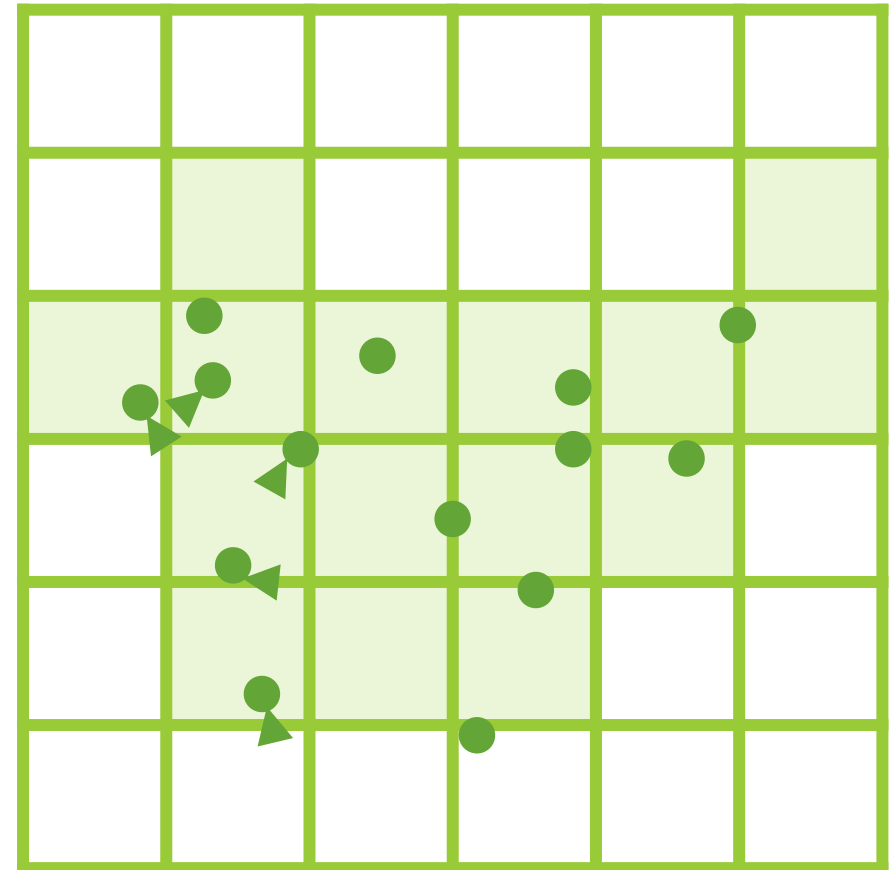
Overlay a background grid

Transfer velocities to background grid

Evolve velocities on the grid

Transfer velocities to particles

Advect particles



# The Particle-In-Cell Method

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Start with particles holding velocities

Overlay a background grid

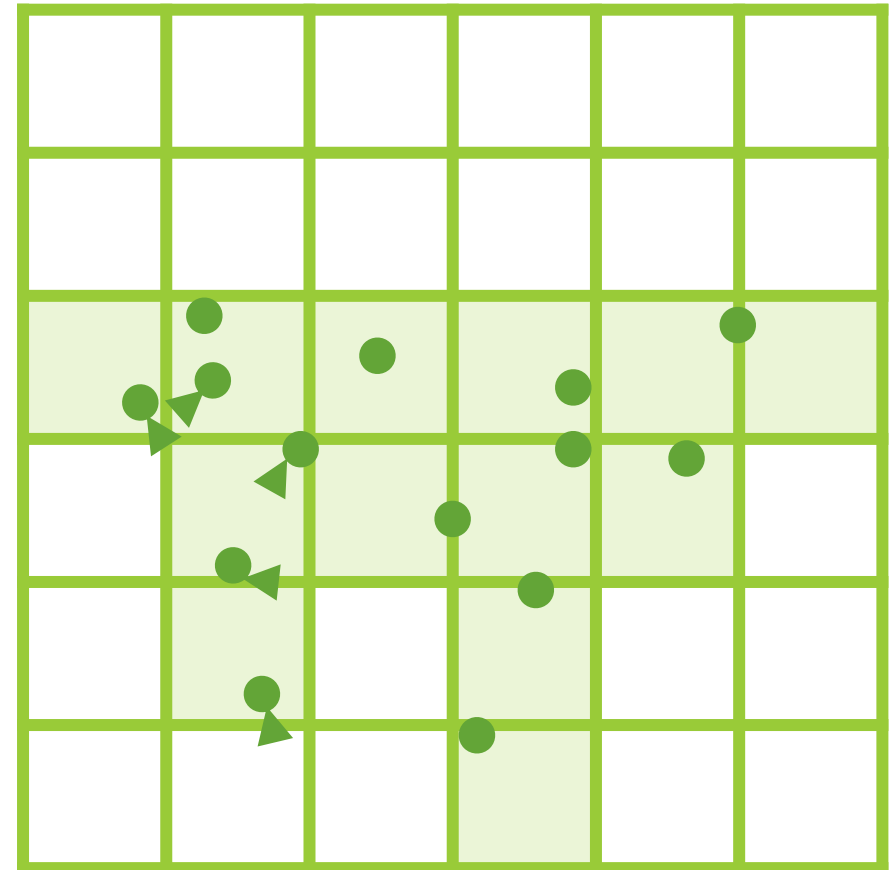
Transfer velocities to background grid

Evolve velocities on the grid

Transfer velocities to particles

Advect particles

Adjust fluid surface representation



# The Particle-In-Cell Method

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Start with particles holding velocities

Overlay a background grid

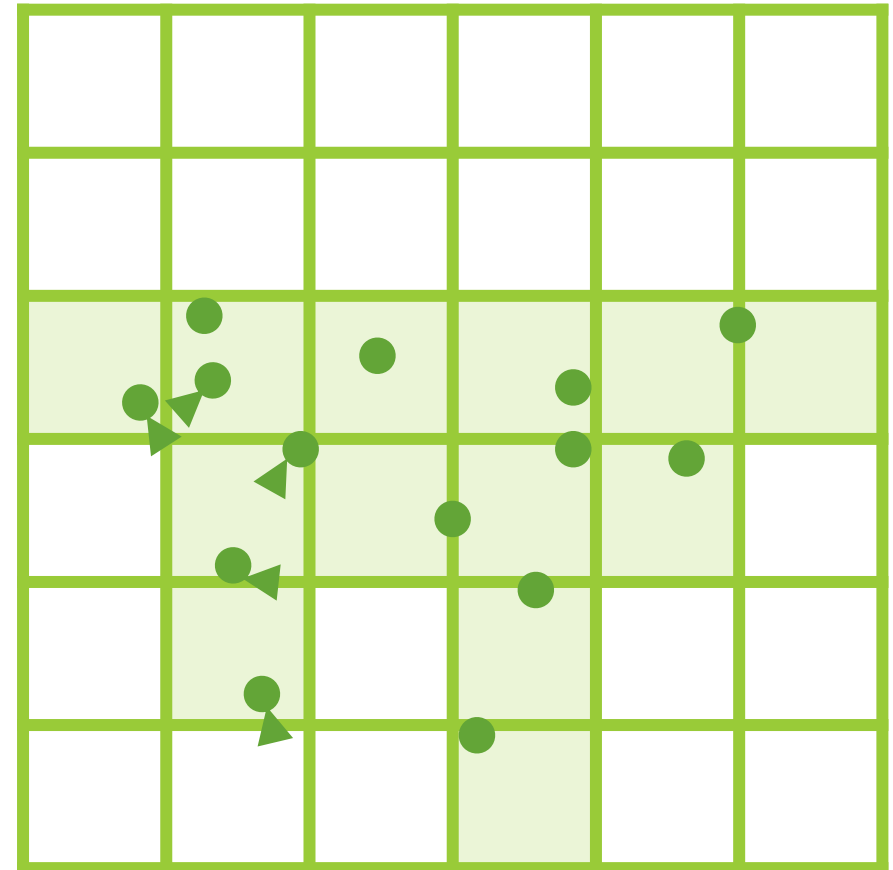
**Transfer velocities to background grid**

Evolve velocities on the grid

**Transfer velocities to particles**

Advect particles

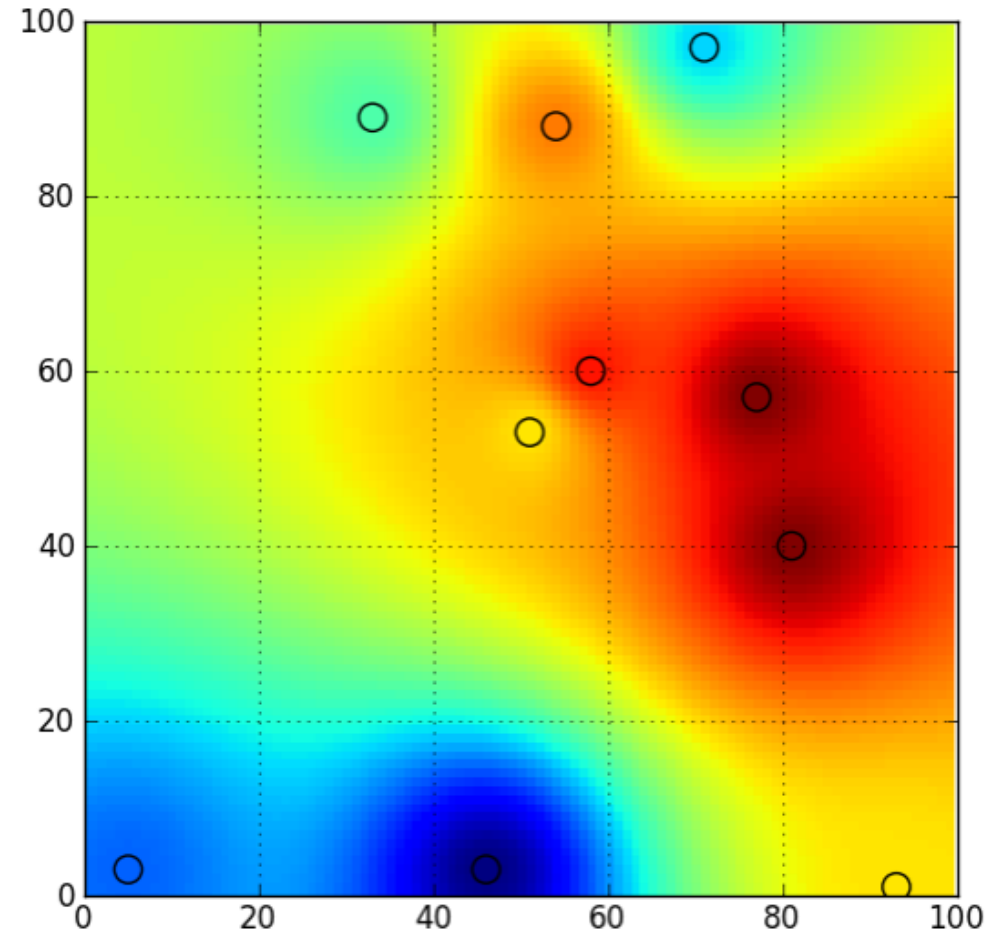
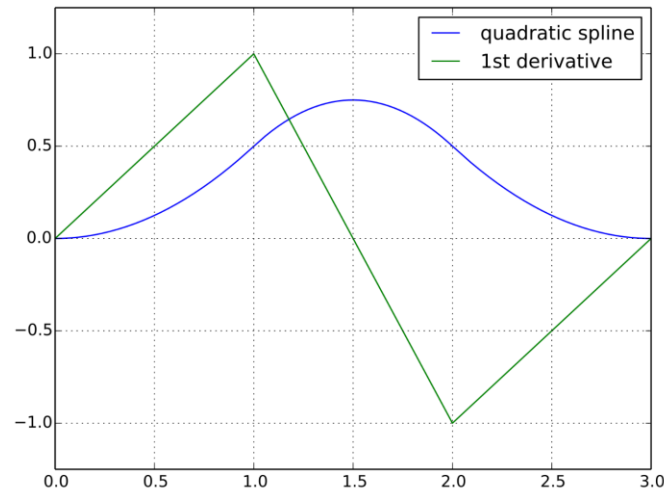
Adjust fluid surface representation



# Particle to Grid Transfer

Take a weighted sum of particle velocities at each grid point

- Weight depends on distance
- Weighing function depends on kernel
- Use a quadratic B-spline kernel



# Fluid Solve

Apply any body and external forces

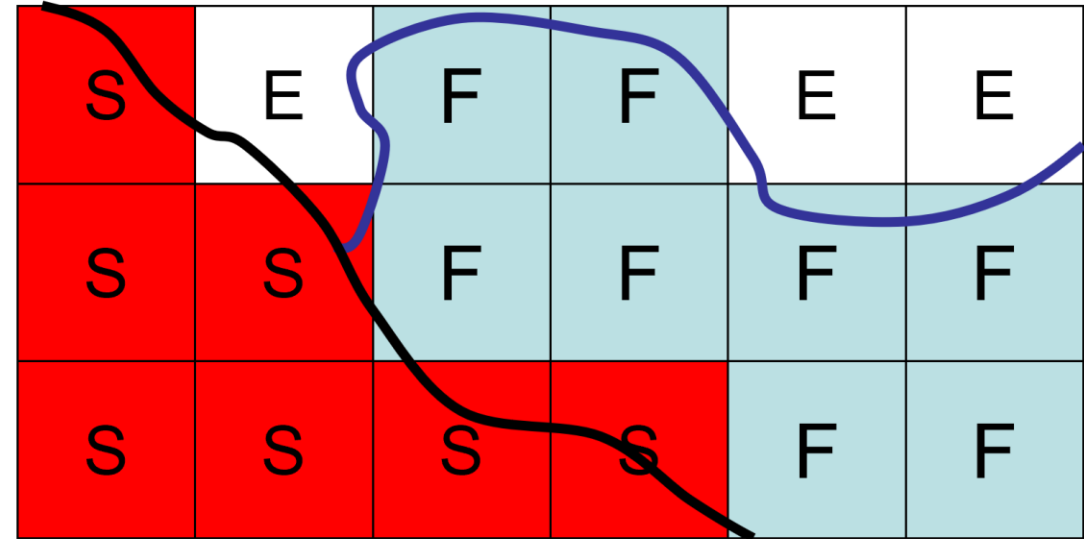
- Eg: gravity

Enforce incompressibility using standard grid-based methods

- Matrix solve on the fluid cells

Careful at boundary conditions

- “No stick” for solid
- Pressure is constant 0 for empty cells
- Voxellized boundaries

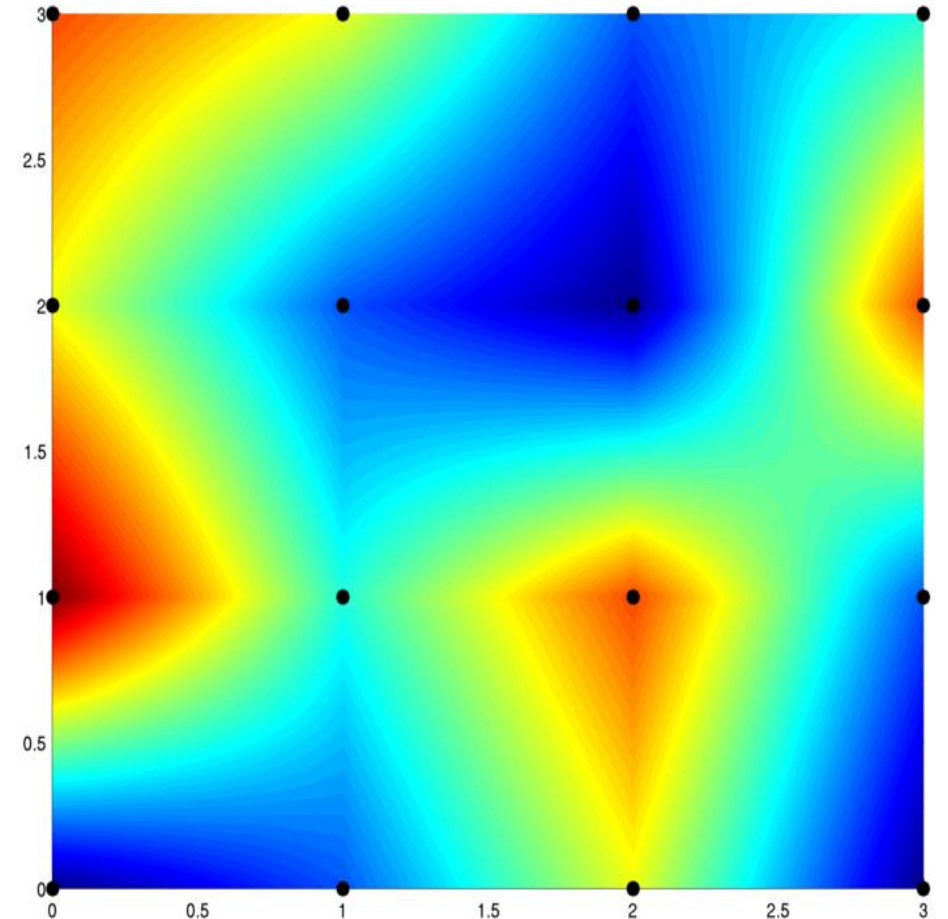
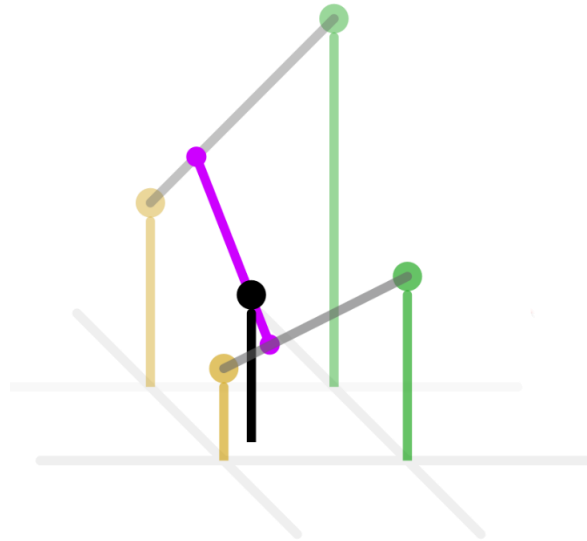




# Grid to Particle Transfer

Simplest interpolation is bilinear

- Take a linear interpolation in one axis, then a linear interpolation across the other



# Advection

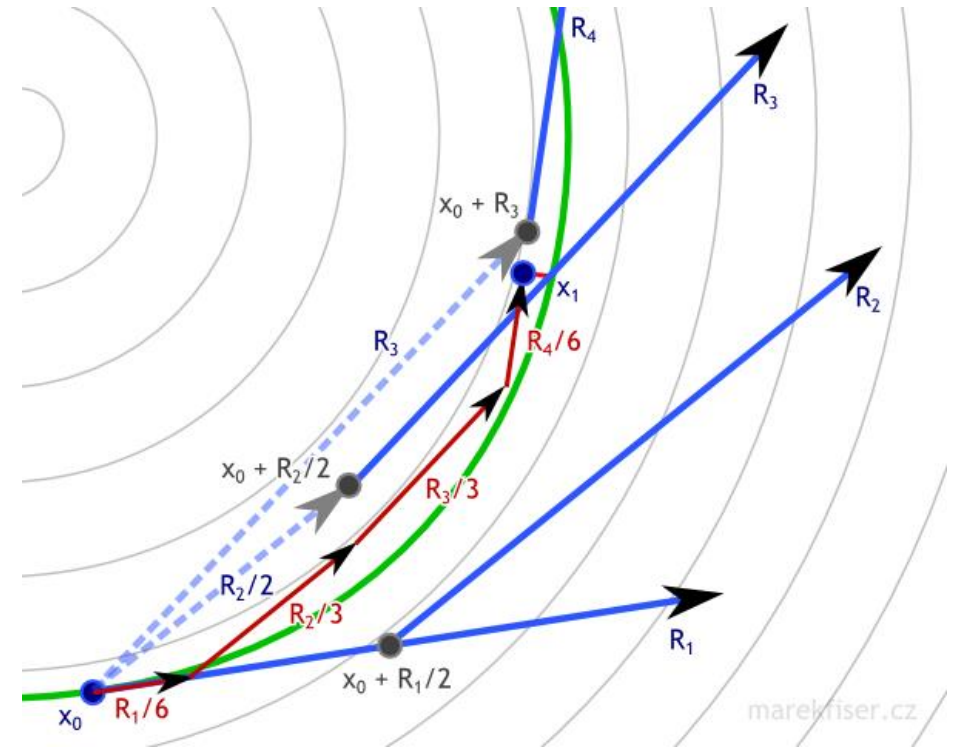
Advect using your favourite  
timestepping scheme

We use Ralston's 3<sup>rd</sup> Order Runge-Kutta

In practice, advection and grid-particle  
transfer must be done at the same  
time

- Intermediate steps of RK needs  
evaluations of the velocity fields

We also need to handle solid collisions



# PIC vs FLIP

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The original Particle-in-Cell method **transferred velocity** from grid to particle

Repeated transfer from particle to grid to particle causes a lot of numerical diffusion

- Due to repeated averaging steps

Alternative is called FLuid-Implicit-Particle method, which **transfers velocity change** from grid to particle

- Note that now you need to save the old velocities

In practice, use a linear combination of PIC/FLIP

# Implementation Details

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Initialize fluid with four “jittered” particles per cell

Use Eigen Linear Algebra library

- Incomplete Cholesky sparse matrix solver

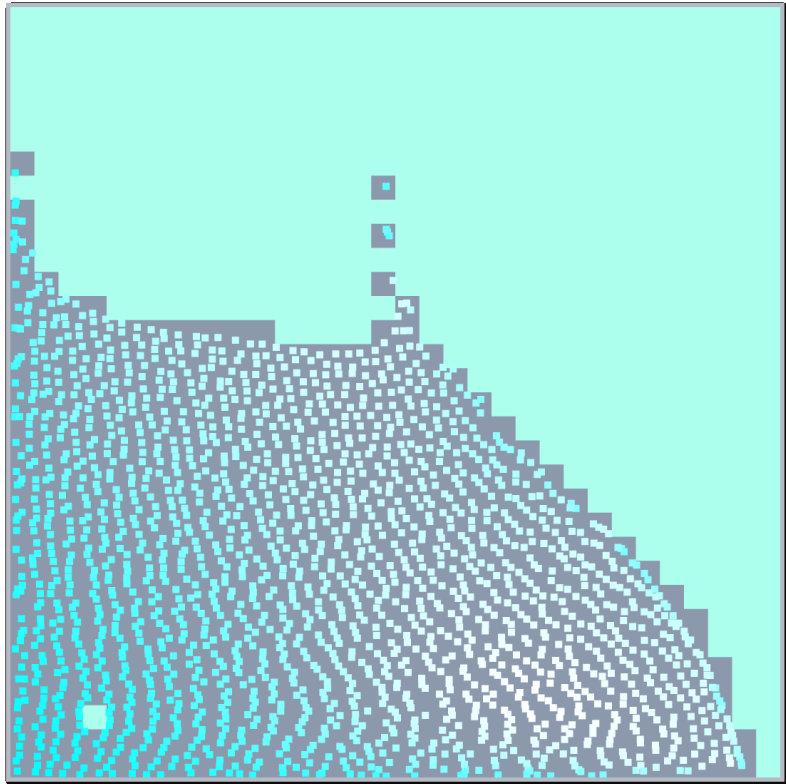
Use substepping in the advection step to satisfy CFL condition

Solid collisions simply re-project backwards to where it initially collided

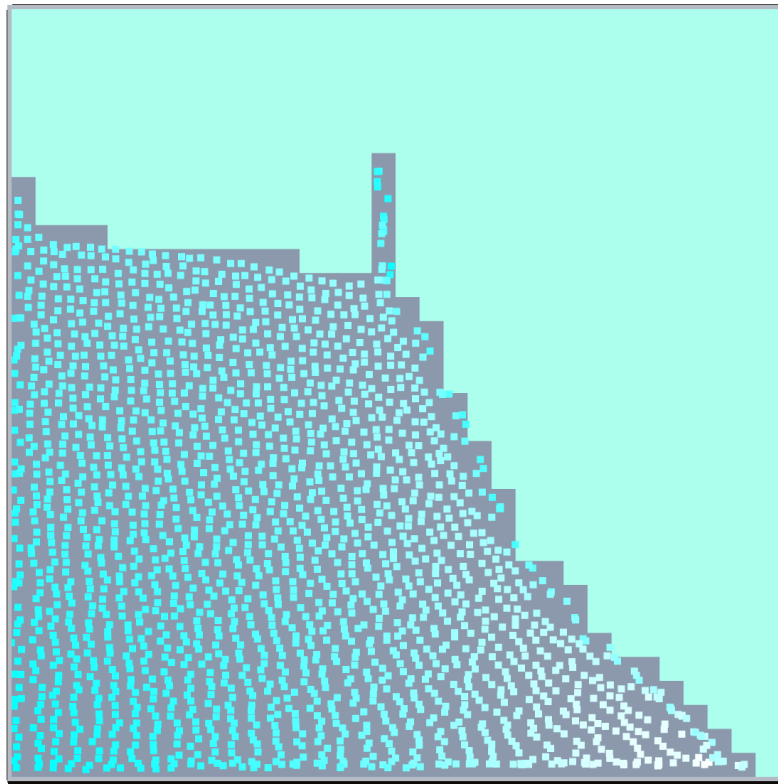
Use OpenGL for visualization

# Results – Dam Break $t=0.3$

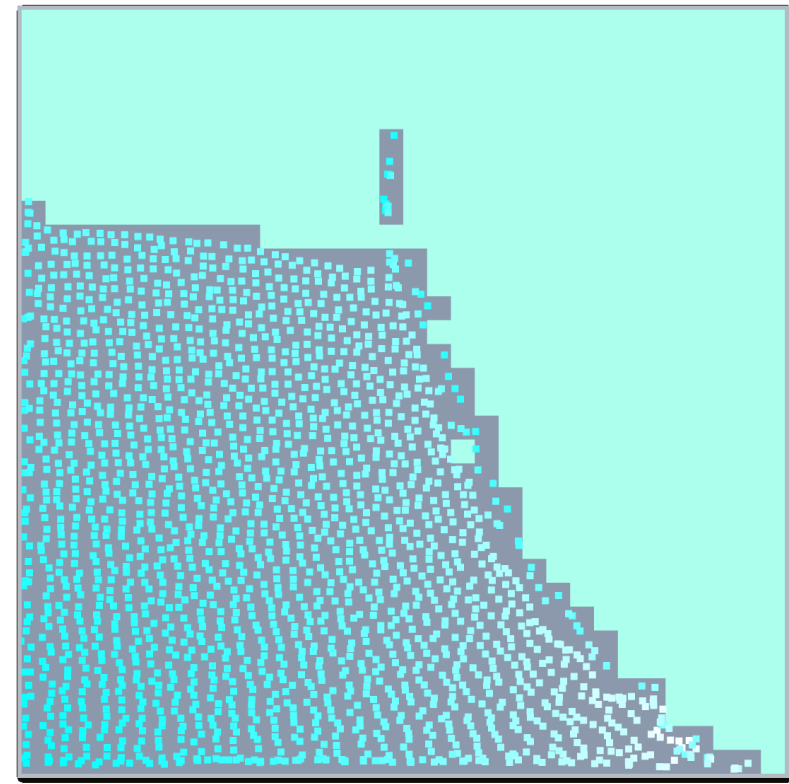
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PIC



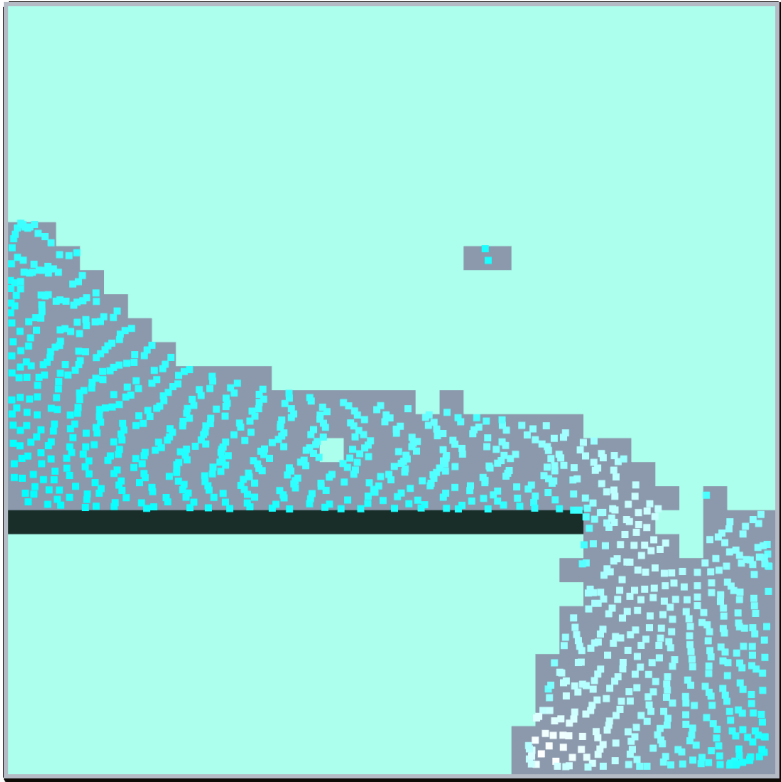
0.9 FLIP



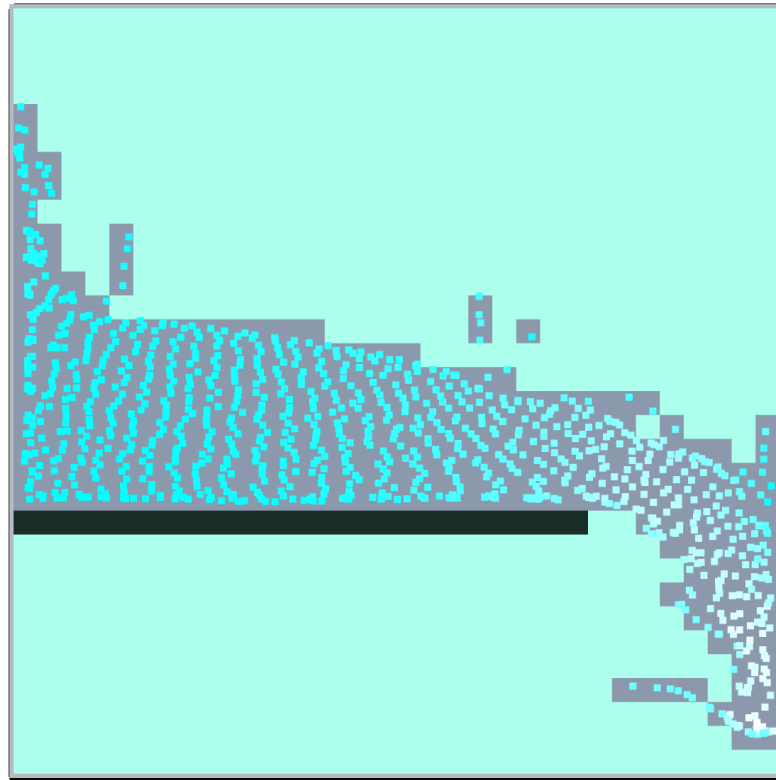
FLIP

# Results – Plank $t=0.5$

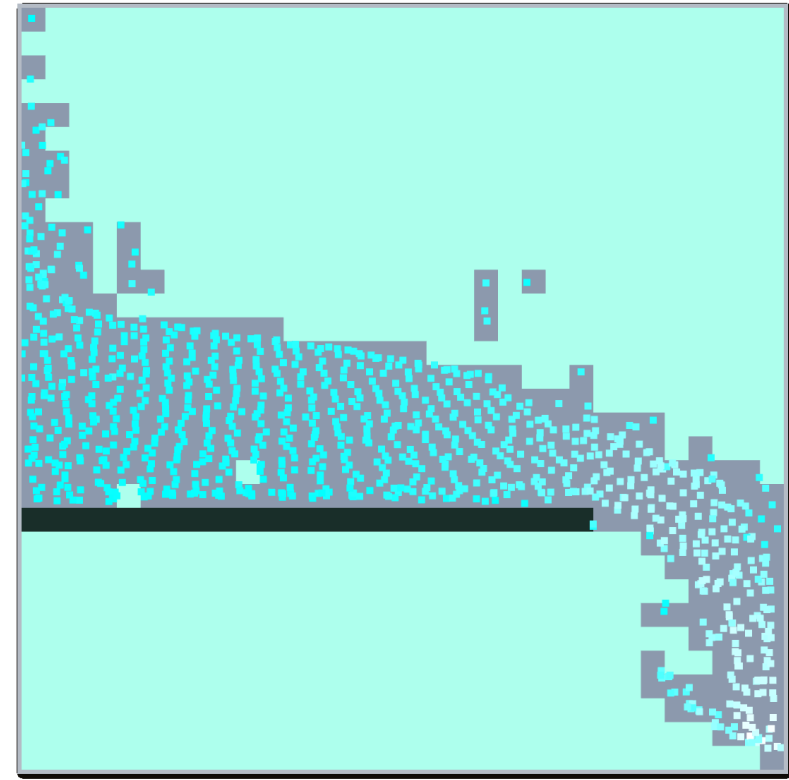
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PIC



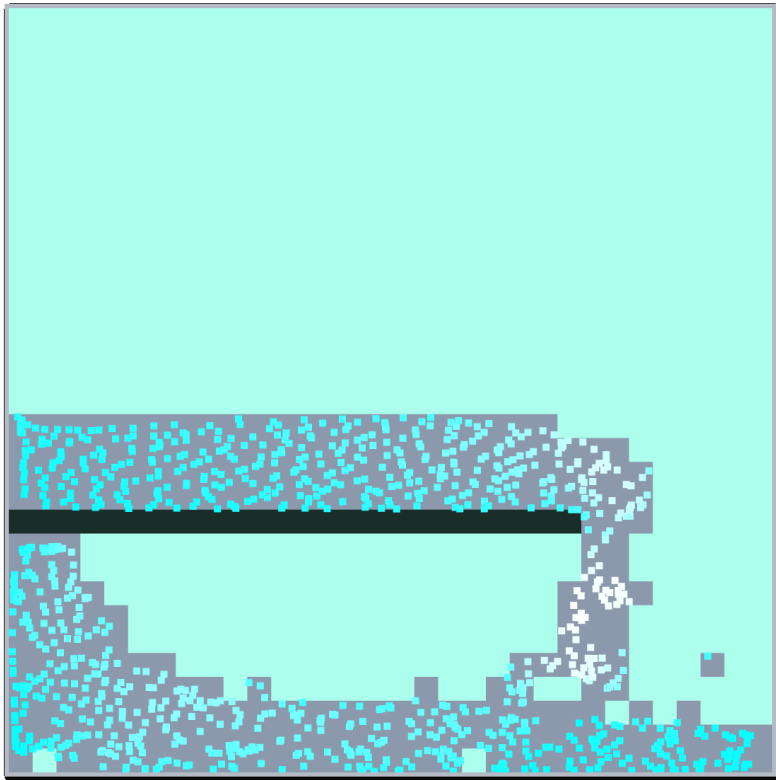
0.9 FLIP



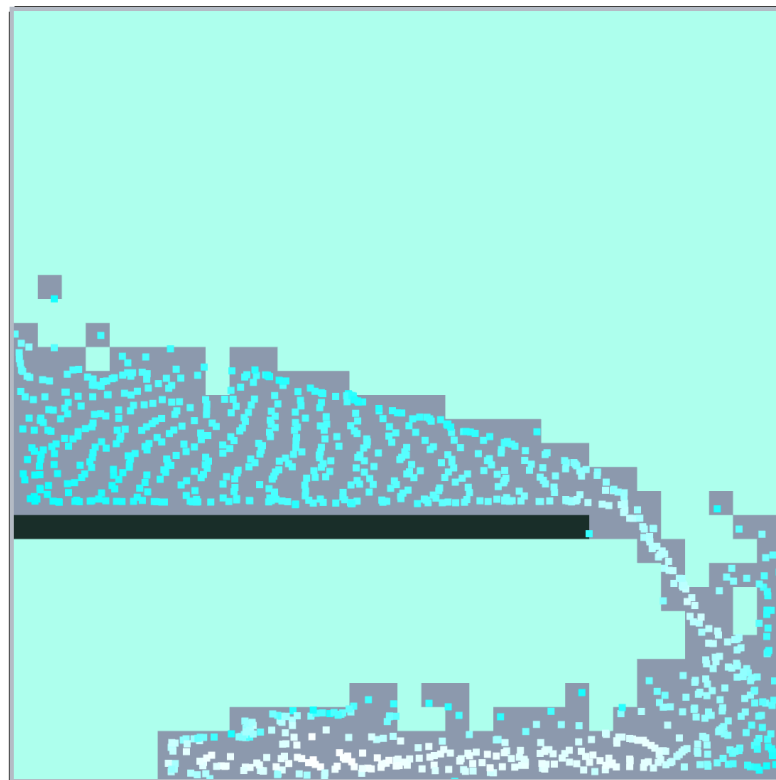
FLIP

# Results – Plank $t=1.0$

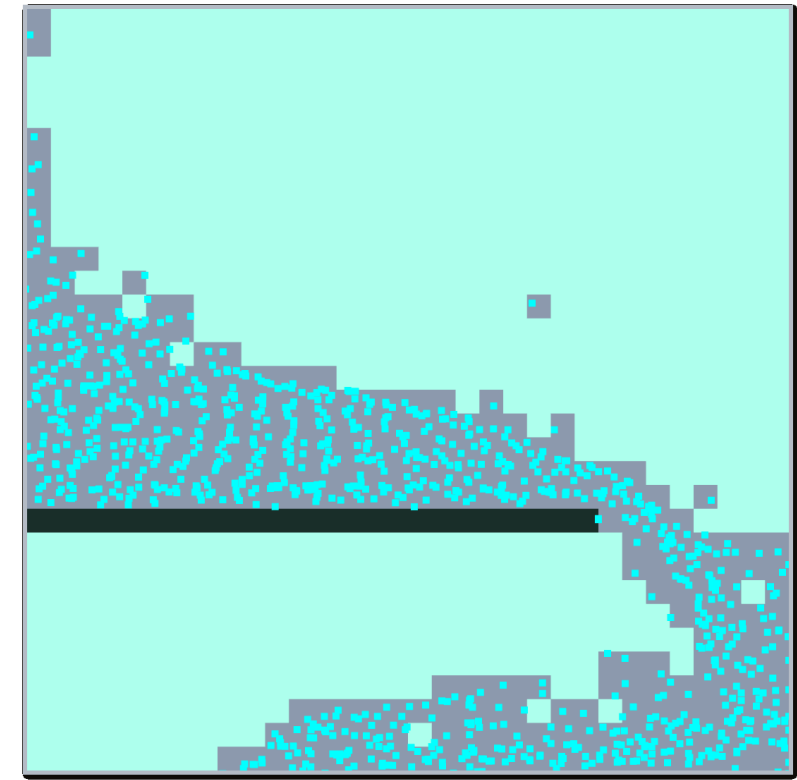
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PIC



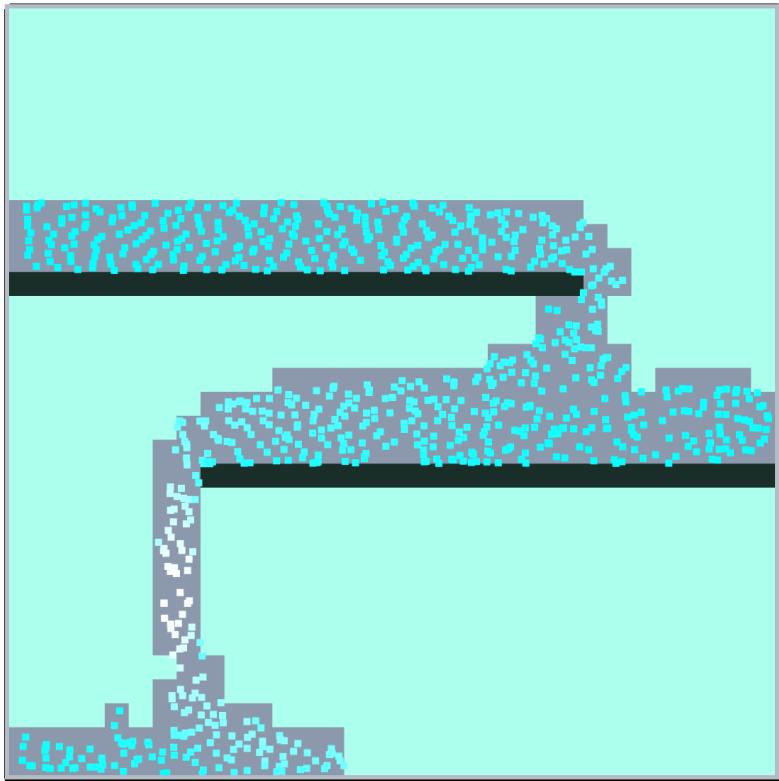
0.9 FLIP



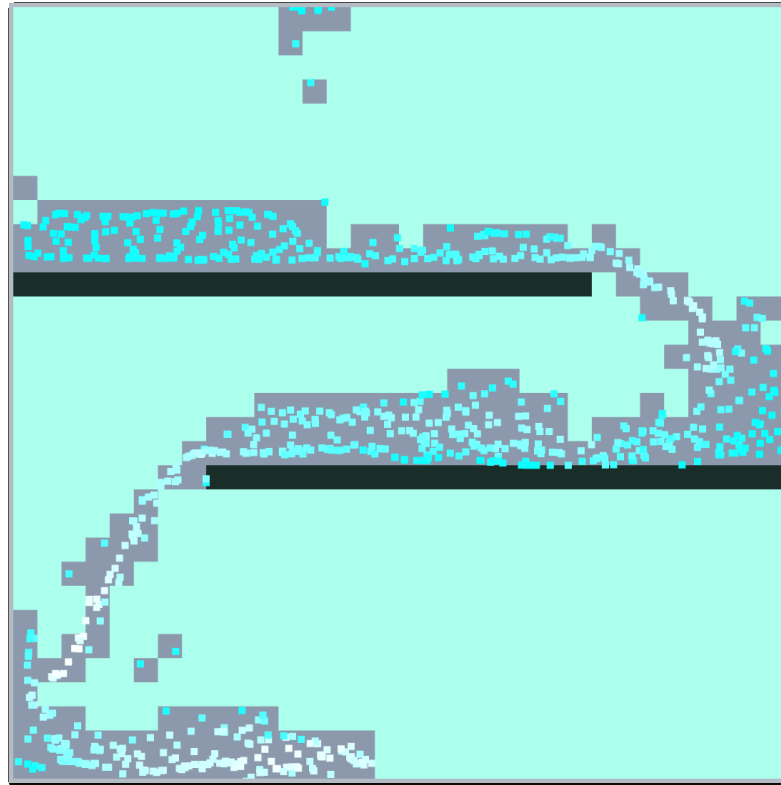
FLIP

# Results – Maze $t=1.5$

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PIC



0.9 FLIP

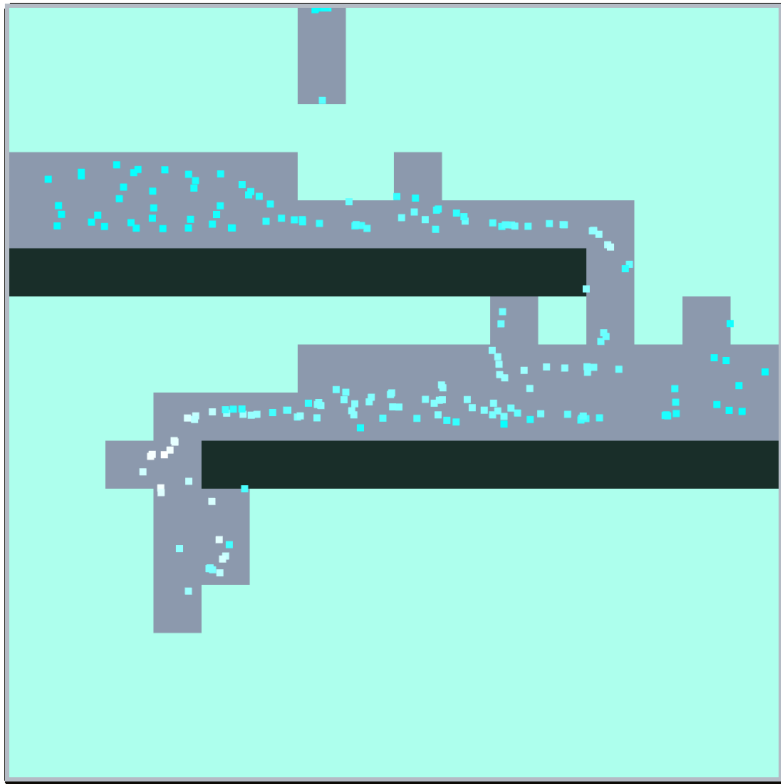
DNF

FLIP

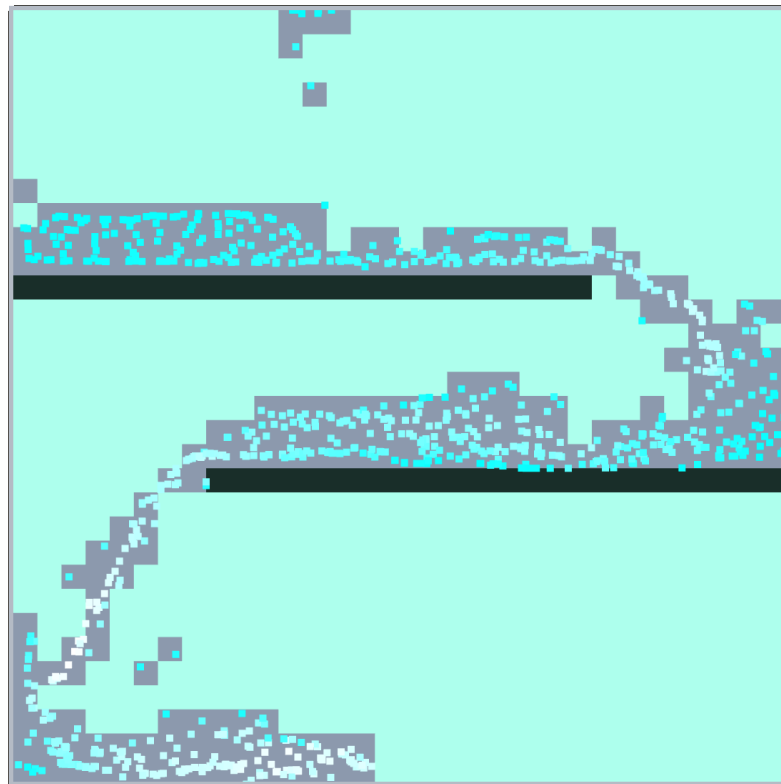


# Results –Resolution Convergence?

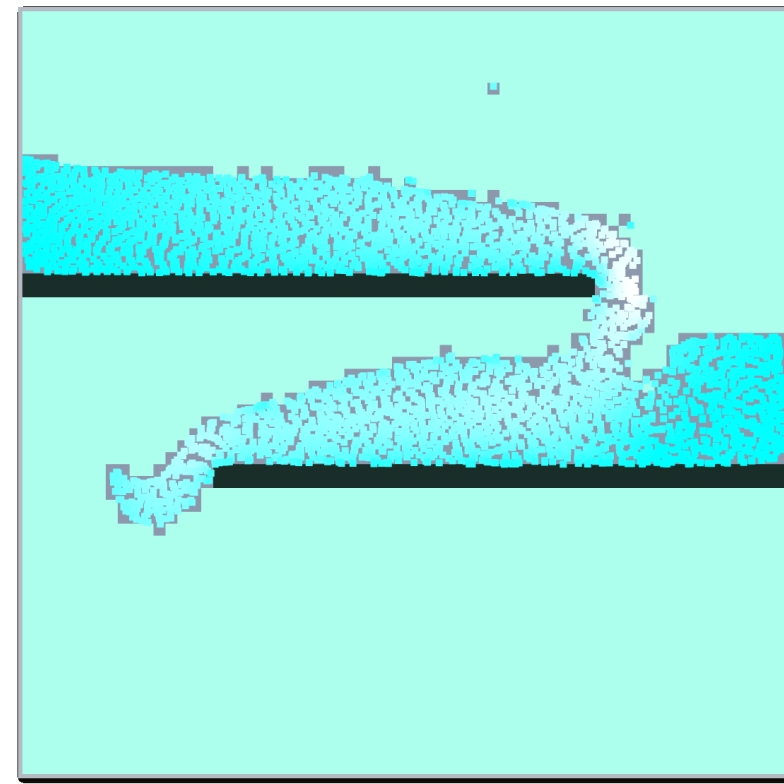
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16x16



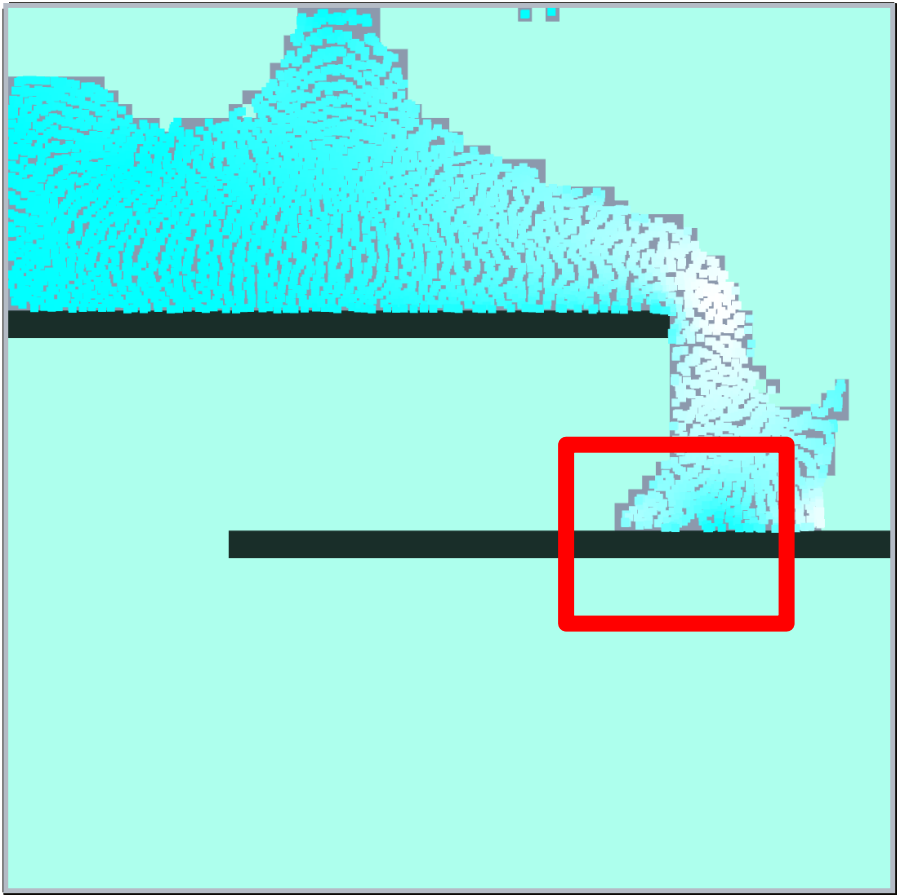
32x32



64x64

# Results – Grid Artifacting

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# Future Work

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Hybrid particle-grid methods are a rich area of current research

Many more features need to be implemented

- Level sets for more accurate surface tracking

More advanced particle-grid interpolations

- “Affine PIC” – regain rigid body rotation
- “Poly PIC” – include higher order modes