

Grid-Based Fluids

COMS 6998 – Problem Solving for
Physical Simulation

Eulerian vs. Lagrangian

Lagrangian

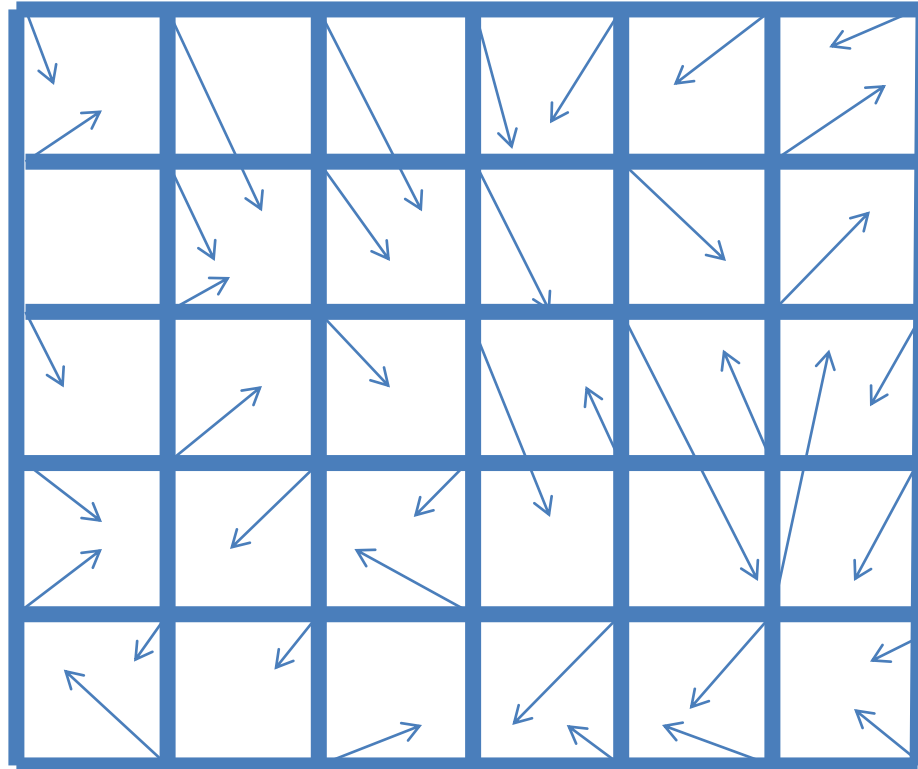
- Particles carry data samples and travel with the flow.

Eulerian

- Samples are fixed in a grid, and information flows past.

Analogy: weather station vs. weather balloon

Eulerian representation



How to evolve grid data?

Recall the material derivative.

$$\frac{D\varphi}{Dt} = \frac{\partial\varphi}{\partial t} + \mathbf{u} \cdot \nabla\varphi$$

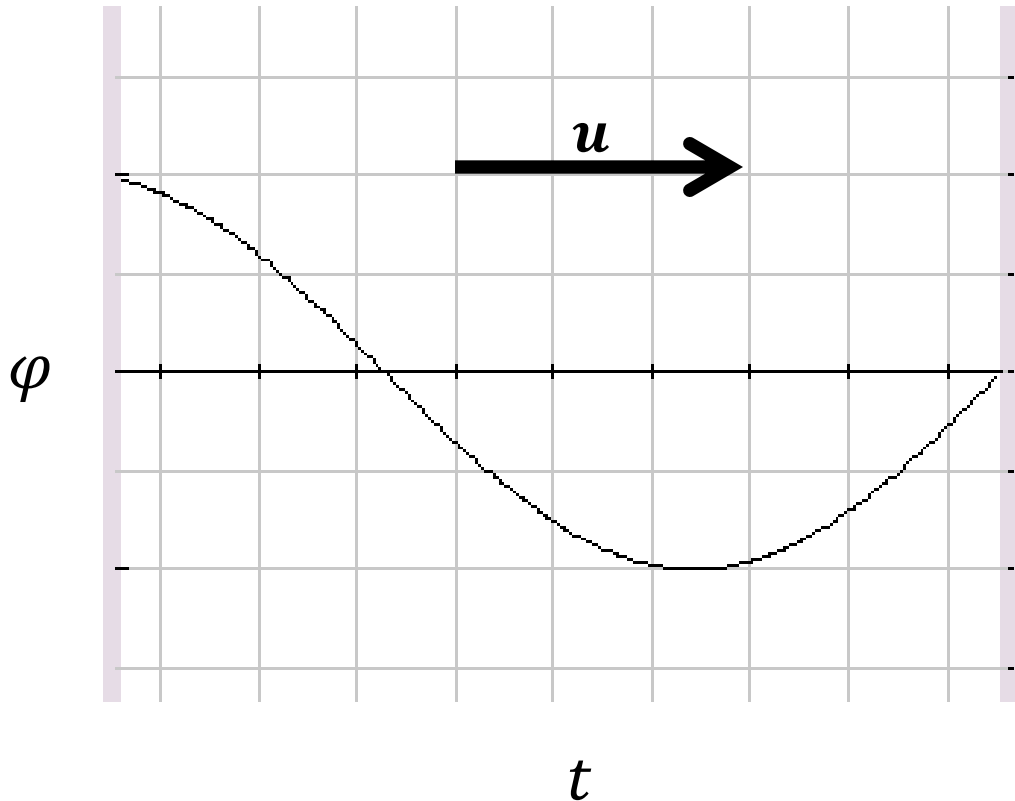
For quantity $\varphi(\mathbf{x}, t)$ under velocity field $\mathbf{u}(\mathbf{x}, t)$.

Material Derivative: Derivation

$$\begin{aligned}\frac{d}{dt}(\varphi(x, t)) &= \frac{\partial \varphi}{\partial t} + \frac{\partial \varphi}{\partial x} \frac{\partial x}{\partial t} && \text{(Chain rule)} \\ &= \frac{\partial \varphi}{\partial t} + \frac{\partial \varphi}{\partial x} u && \text{(Definition of } u\text{)} \\ &= \frac{\partial \varphi}{\partial t} + \nabla \varphi \cdot u && \text{(Definition of gradient)} \\ &= \frac{\partial \varphi}{\partial t} + u \cdot \nabla \varphi && \text{(Rearrange)}\end{aligned}$$

Advection term

$$\frac{D\varphi}{Dt} = \frac{\partial\varphi}{\partial t} + \mathbf{u} \cdot \nabla\varphi$$



Computing Advection

Different methods:

- 1) Particles (Lagrangian)
- 2) Particle-in-cell
- 3) Semi-Lagrangian
- 4) Eulerian

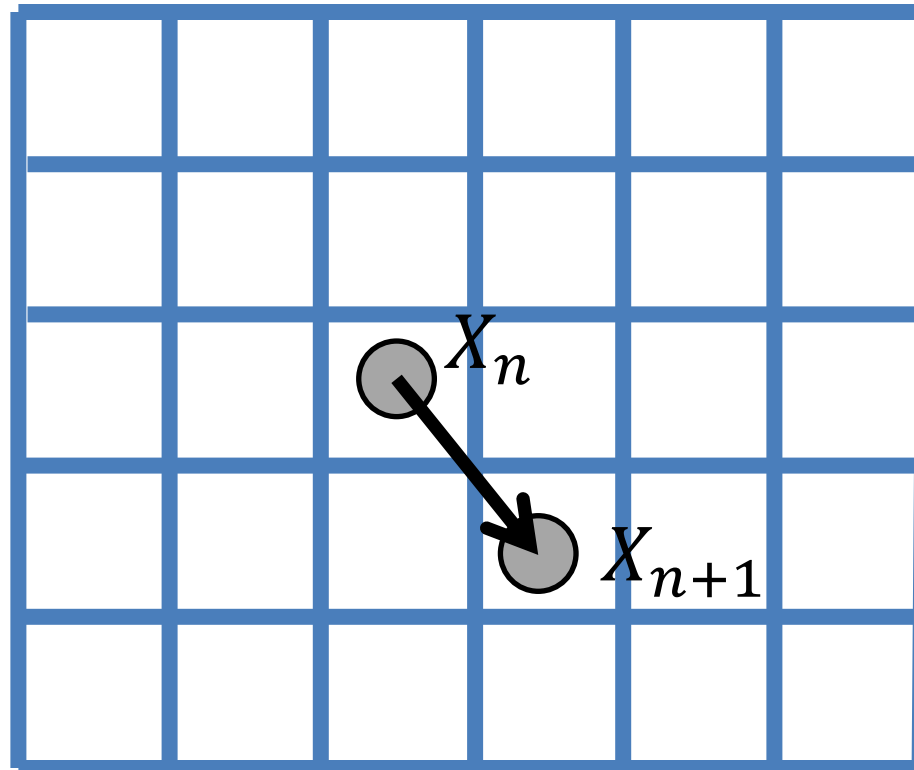
Consider $\frac{\partial \varphi}{\partial t} + u \cdot \nabla \varphi = 0$.

Particles (Lagrangian)

Interpolate velocity at particle location.

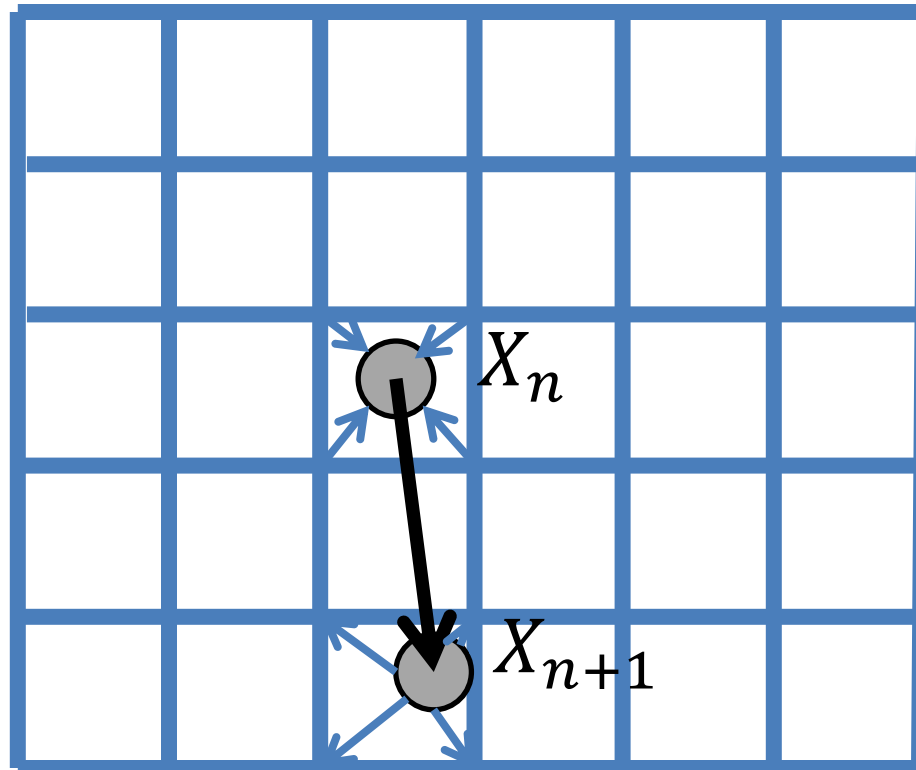
Integrate to get new position (eg. Runge-Kutta).

Does not feedback into grid.



Particle-In-Cell

- 1) Interpolate grid data (φ) onto particle.
- 2) Update particle position (Lagrangian).
- 3) Spread φ back onto the grid.



Eulerian

Approximate derivatives with grid-based finite differences.

$$\frac{\partial \varphi}{\partial t} + \mathbf{u} \cdot \nabla \varphi = 0$$

FTCS = Forward Time, Centered Space:

$$\frac{\varphi_i^{n+1} - \varphi_i^n}{\Delta t} + u \frac{\varphi_{i+1}^n - \varphi_{i-1}^n}{2\Delta x} = 0$$

Unconditionally
Unstable!

Lax:

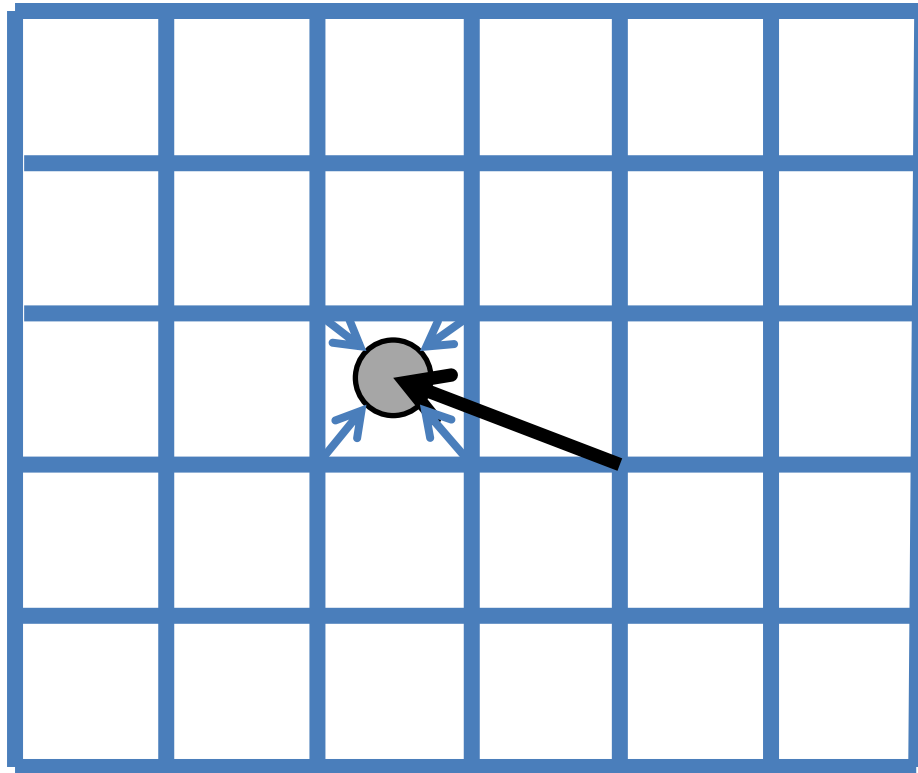
$$\frac{\varphi_i^{n+1} - (\varphi_{i+1}^n + \varphi_{i-1}^n)/2}{\Delta t} + u \frac{\varphi_{i+1}^n - \varphi_{i-1}^n}{2\Delta x} = 0$$

Conditionally
Stable!

Many methods, stability can be a challenge.

Semi-Lagrangian

Look *backwards* in time from grid points, to see where data is coming *from*.



Navier-Stokes revisited

$$\frac{\partial \mathbf{u}}{\partial t} + \mathbf{u} \cdot \nabla \mathbf{u} = -\frac{1}{\rho} \nabla p + \frac{\mu}{\rho} \nabla \cdot \nabla \mathbf{u} + \mathbf{g}$$

$\frac{\partial \mathbf{u}}{\partial t} \approx$ advection + pressure + viscosity + gravity

Use “operator splitting”: Treat each step independently.

Velocity Advection

Arbitrary quantity φ :
$$\frac{\partial \varphi}{\partial t} + \mathbf{u} \cdot \nabla \varphi = 0$$

Velocity \mathbf{u} :
$$\frac{\partial \mathbf{u}}{\partial t} + \mathbf{u} \cdot \nabla \mathbf{u} = 0$$

Advect velocity as if it were any other quantity.

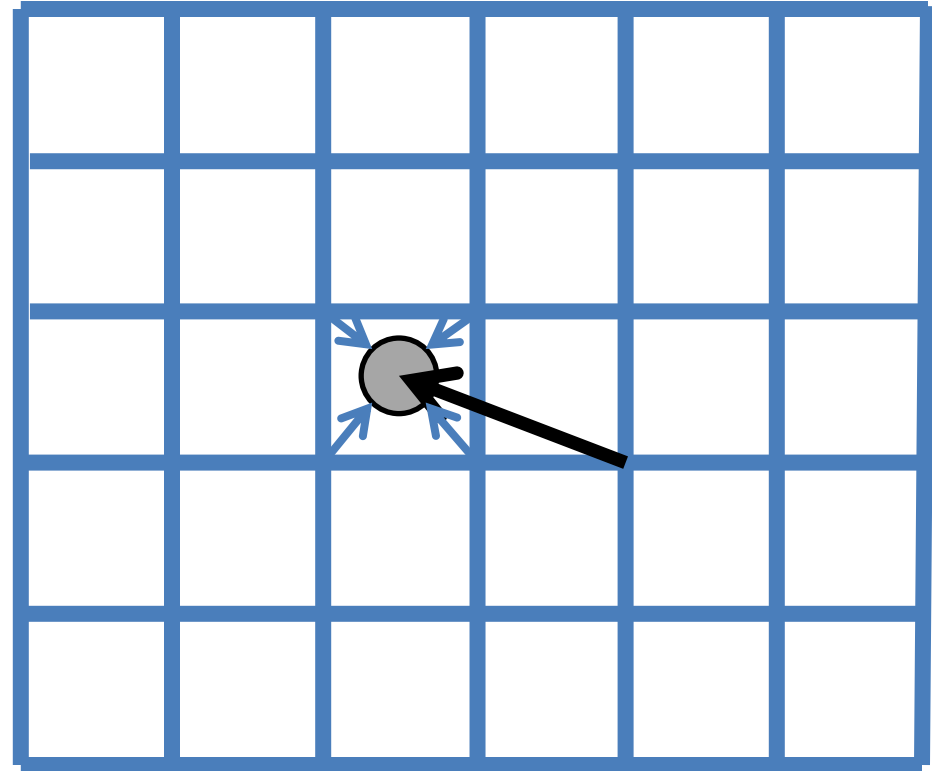
Velocity Advection

Semi-Lagrangian most common.

- Stable
- Easy to implement
- Intuitive

Drawbacks:

- Numerical dissipation



Incompressibility

Advection or other steps might introduce compression/expansion.



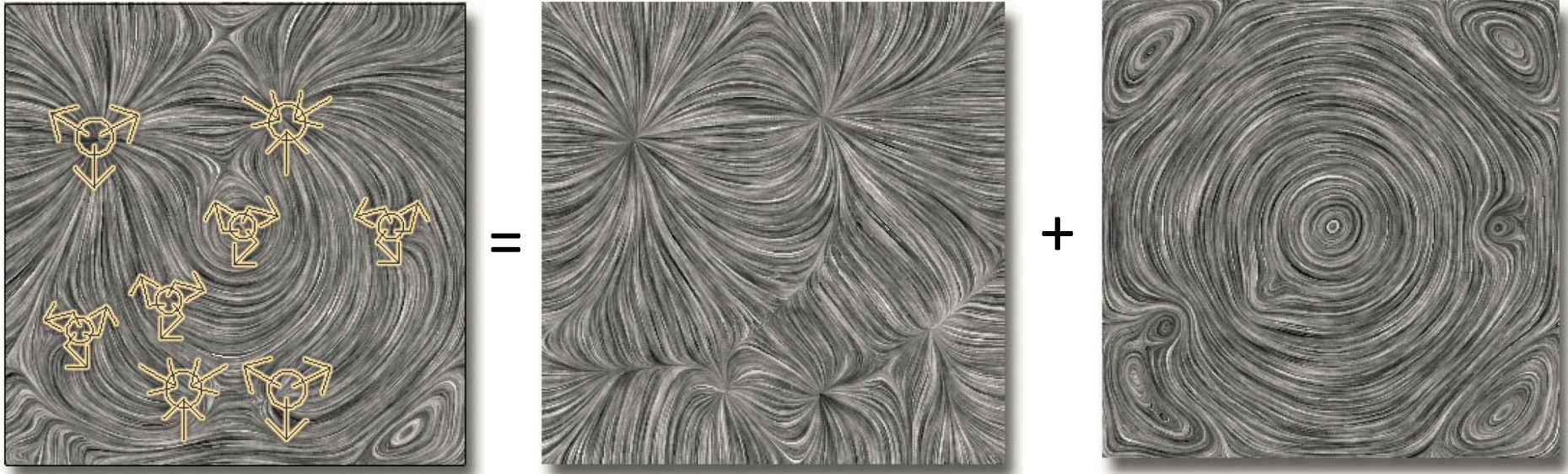
From [Tong et al 2003]
[Discrete Multiscale](#)
[Vector Field](#)
[Decomposition](#)

Helmholtz-Hodge Decomposition

Input Velocity field

Curl-Free
(irrotational)

Divergence-Free
(incompressible)



$$u = \nabla p + u^{div_free}$$

Incompressibility

$$\mathbf{u}^{div_free} = \mathbf{u} - \nabla p \quad (1)$$

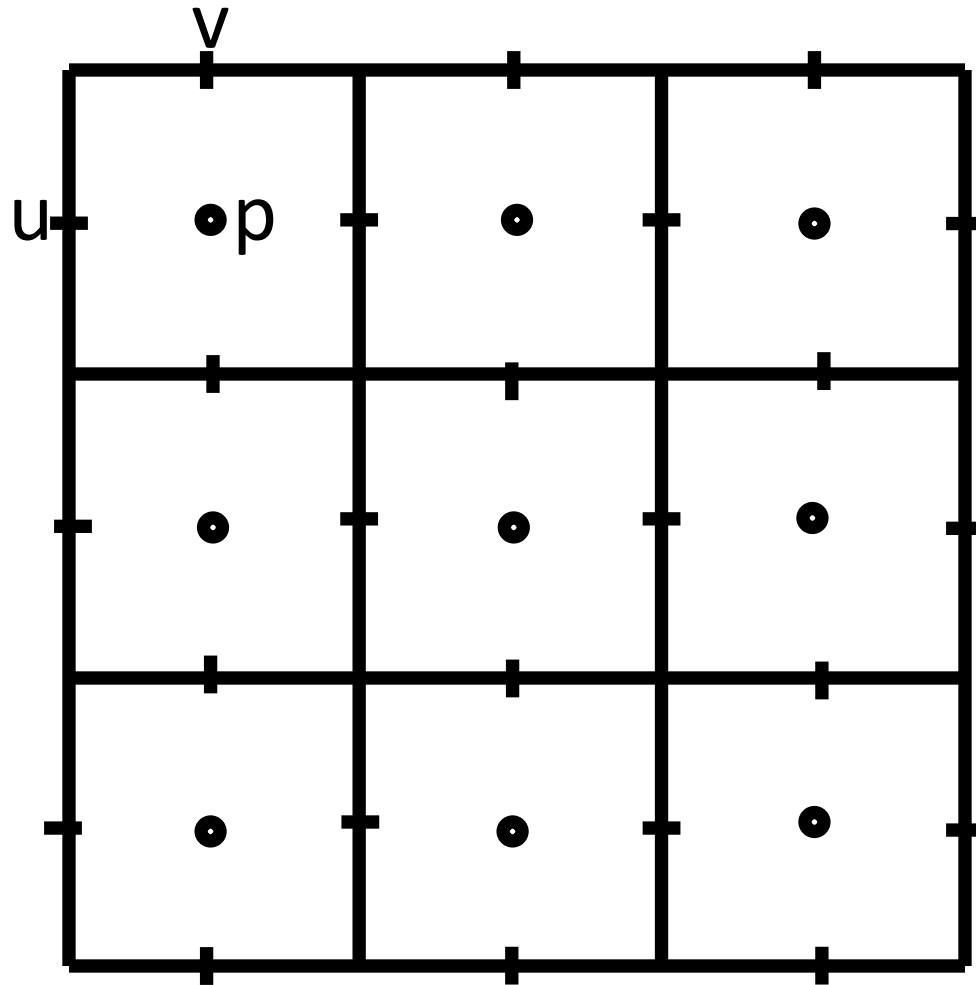
$$\nabla \cdot \mathbf{u}^{div_free} = 0 \quad (2)$$



$$\nabla \cdot \nabla p = \nabla \cdot \mathbf{u} \quad (3)$$

Solve (3), then plug into (1) to find new incompressible velocity field.

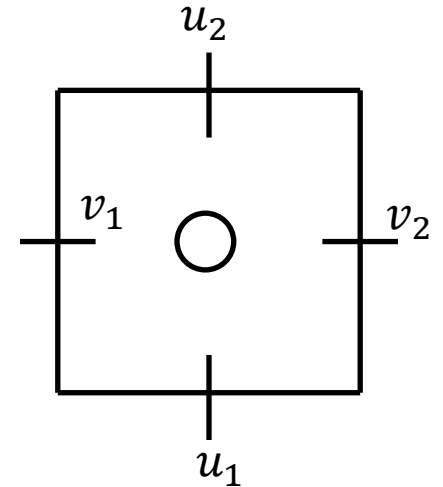
Incompressibility – Staggered Grids



Incompressibility – Staggered Grids

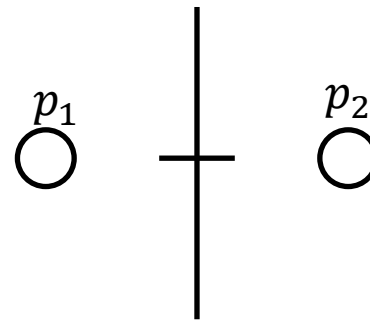
Divergence:

$$\nabla \cdot u = \frac{\partial u}{\partial x} + \frac{\partial v}{\partial y} \approx \frac{u_2 - u_1 + v_2 - v_1}{\Delta x}$$



Gradient:

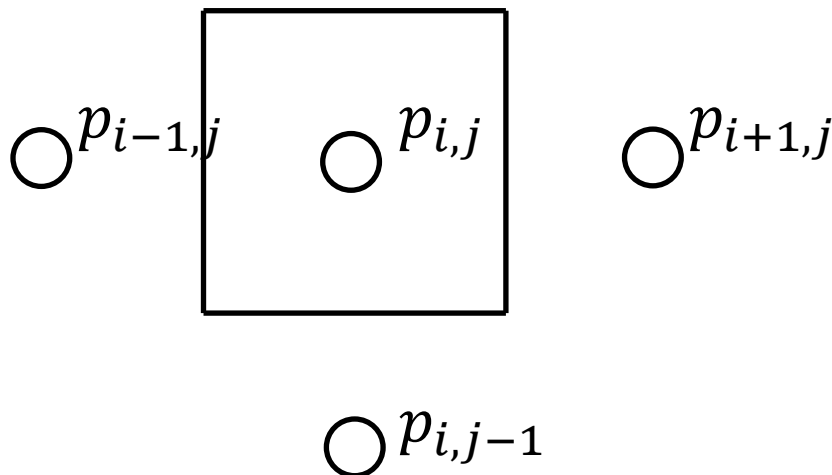
$$\nabla_x p = \frac{\partial p}{\partial x} \approx \frac{p_2 - p_1}{\Delta x}$$



Incompressibility – Staggered Grids

Laplacian (divergence of gradient):

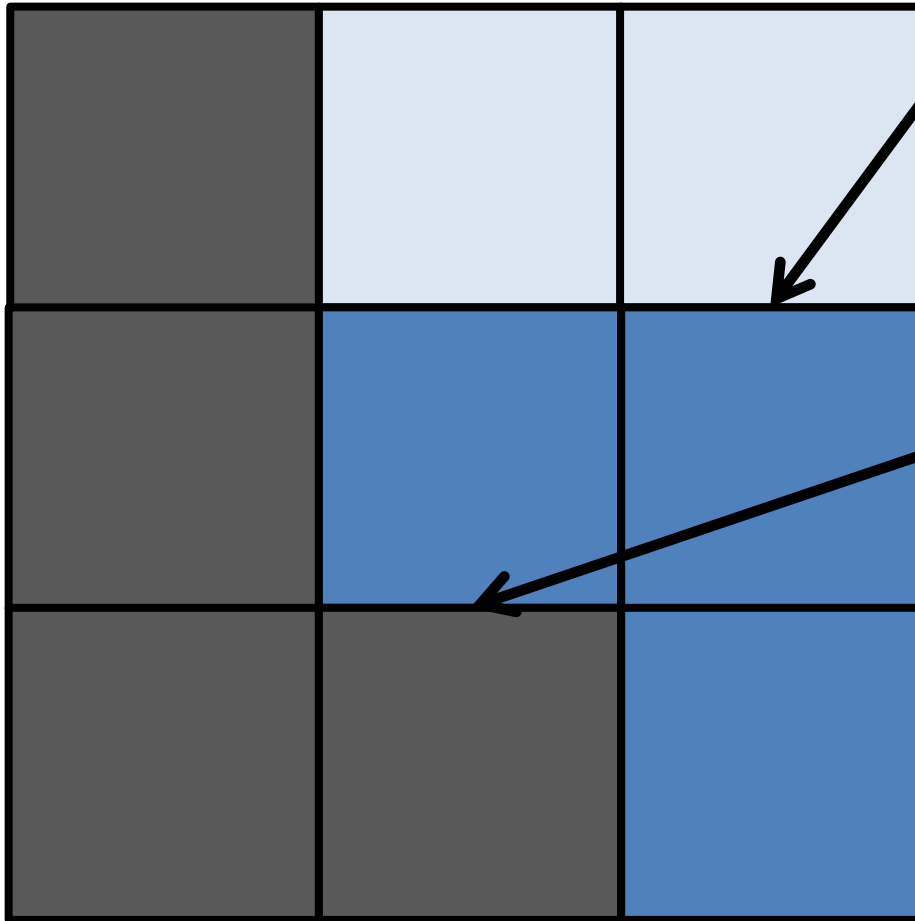
$$\nabla \cdot \nabla p = \nabla \cdot \left(\frac{\partial p}{\partial x}, \frac{\partial p}{\partial y} \right) = \frac{\partial^2 p}{\partial x^2} + \frac{\partial^2 p}{\partial y^2} \approx \frac{\frac{p_{i+1,j} - p_{i,j}}{\Delta x} - \frac{p_{i,j} - p_{i-1,j}}{\Delta x}}{\Delta x} + \frac{\frac{p_{i,j+1} - p_{i,j}}{\Delta x} - \frac{p_{i,j} - p_{i,j-1}}{\Delta x}}{\Delta x}$$



5-point stencil:

$$\begin{array}{ccc} & 1 & \\ 1 & -4 & 1 \\ & 1 & \end{array}$$

Boundaries



Fluid-Air: $p = p_{\text{air}}$
(ie. constant)

Fluid-Solid: $\mathbf{u} \cdot \mathbf{n} = 0$

Solving $\nabla \cdot \nabla p = \nabla \mathbf{u}$

A Poisson equation:

- Sparse, positive definite linear system of equations.
- One equation per cell, cells globally coupled.
- Typically, solve with conjugate gradient or multigrid.

Viscosity



[Carlson et al. 2003]

Viscosity

PDE:
$$\frac{\partial \mathbf{u}}{\partial t} = \frac{\mu}{\rho} \nabla \cdot \nabla \mathbf{u}$$

Discretized in time:

$$\mathbf{u}_{new} = \mathbf{u}_{old} + \frac{\Delta t \mu}{\rho} \nabla \cdot \nabla \mathbf{u}_*$$

If \mathbf{u}_* is \mathbf{u}_{old} , explicit integration.

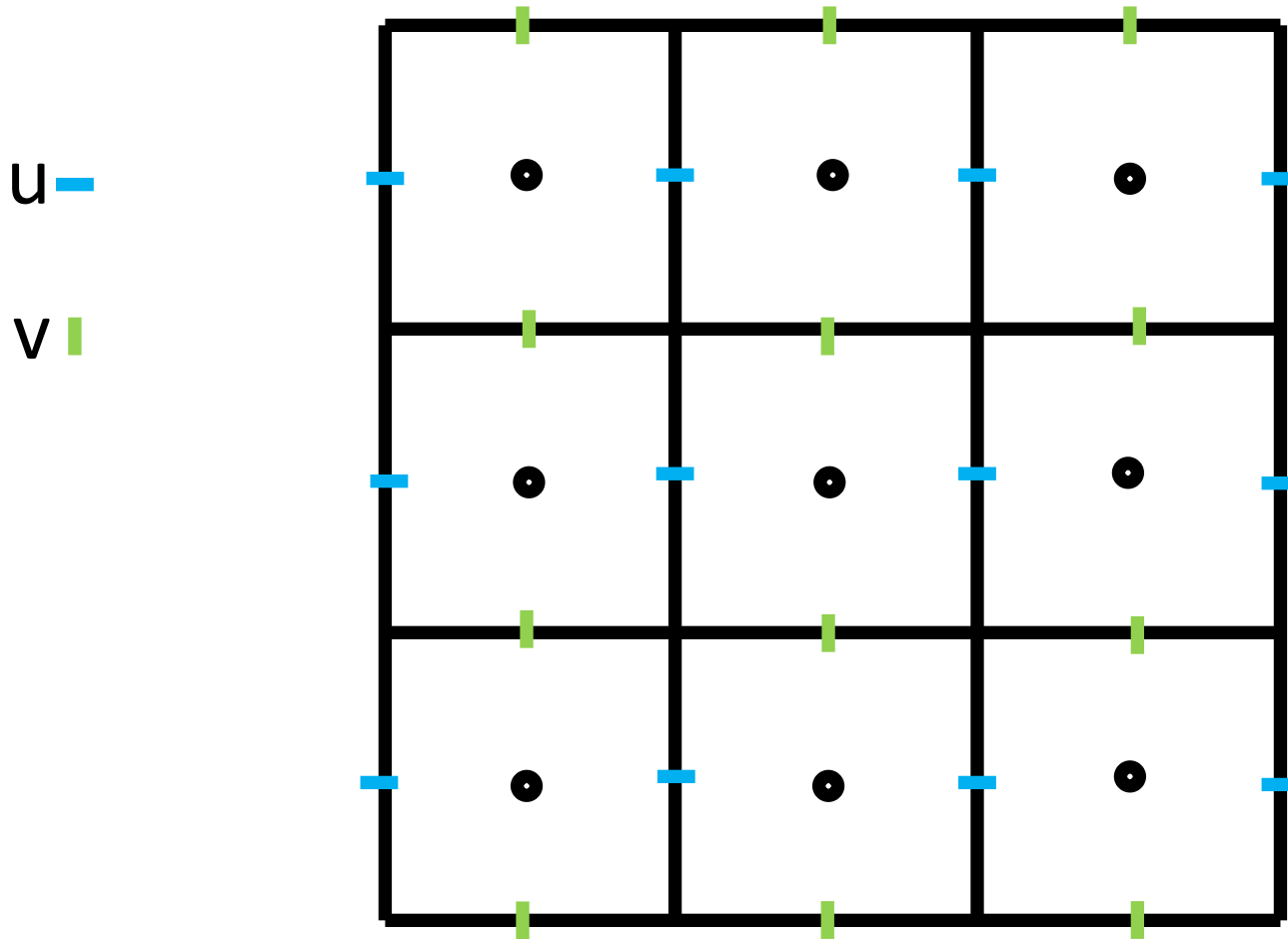
- No need to solve linear system.

If \mathbf{u}_* is \mathbf{u}_{new} , implicit integration.

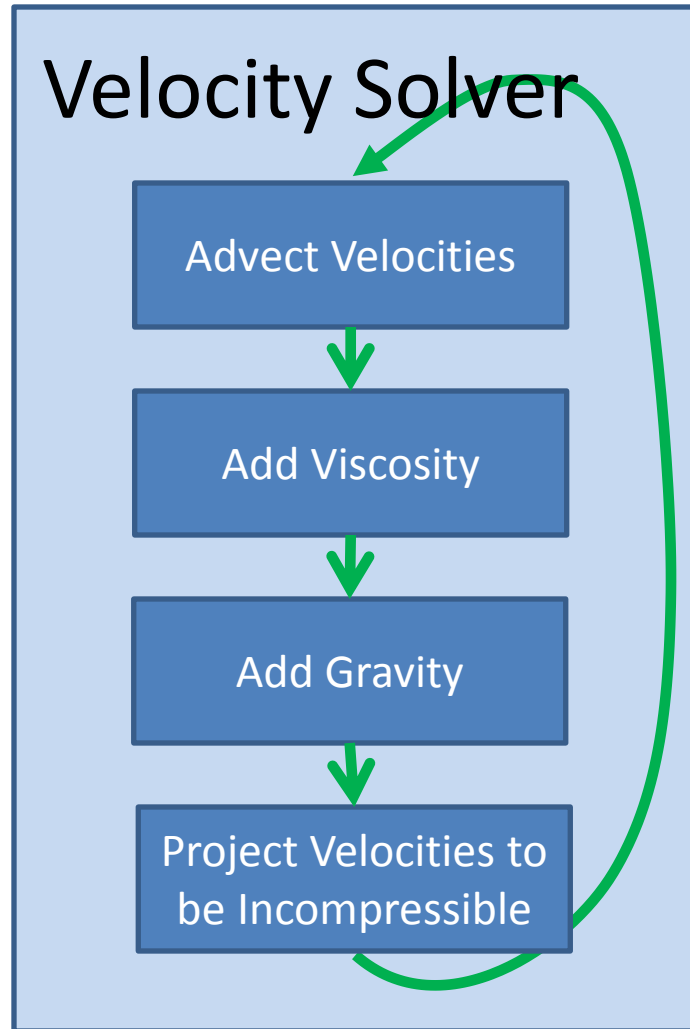
- Stable for high viscosities.

Viscosity

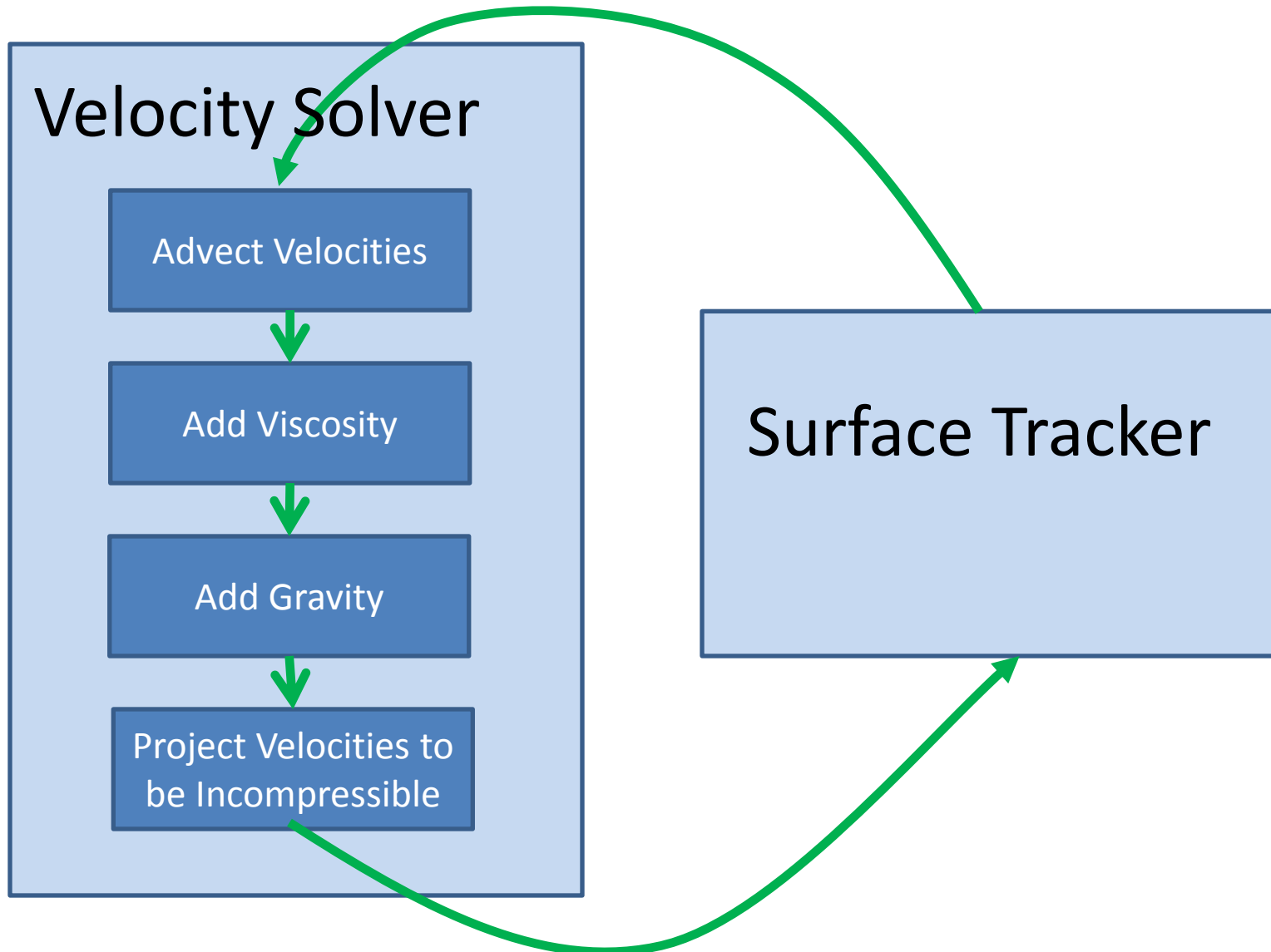
Applies smoothing to each velocity component (ie. u , v , w) independently.



The Big Picture



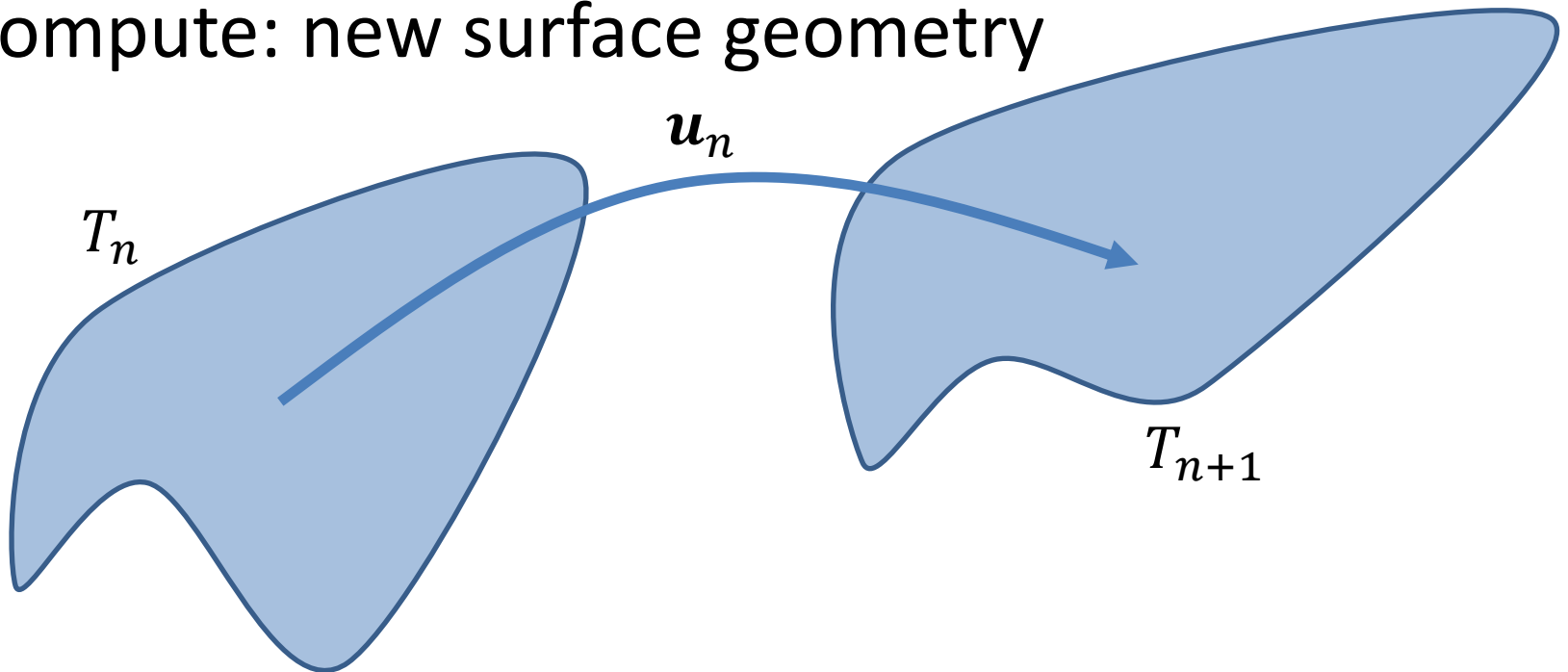
What about liquids?



Surface Tracker

Given: liquid surface geometry, velocity field, timestep

Compute: new surface geometry



Surface Tracker

Ideally:

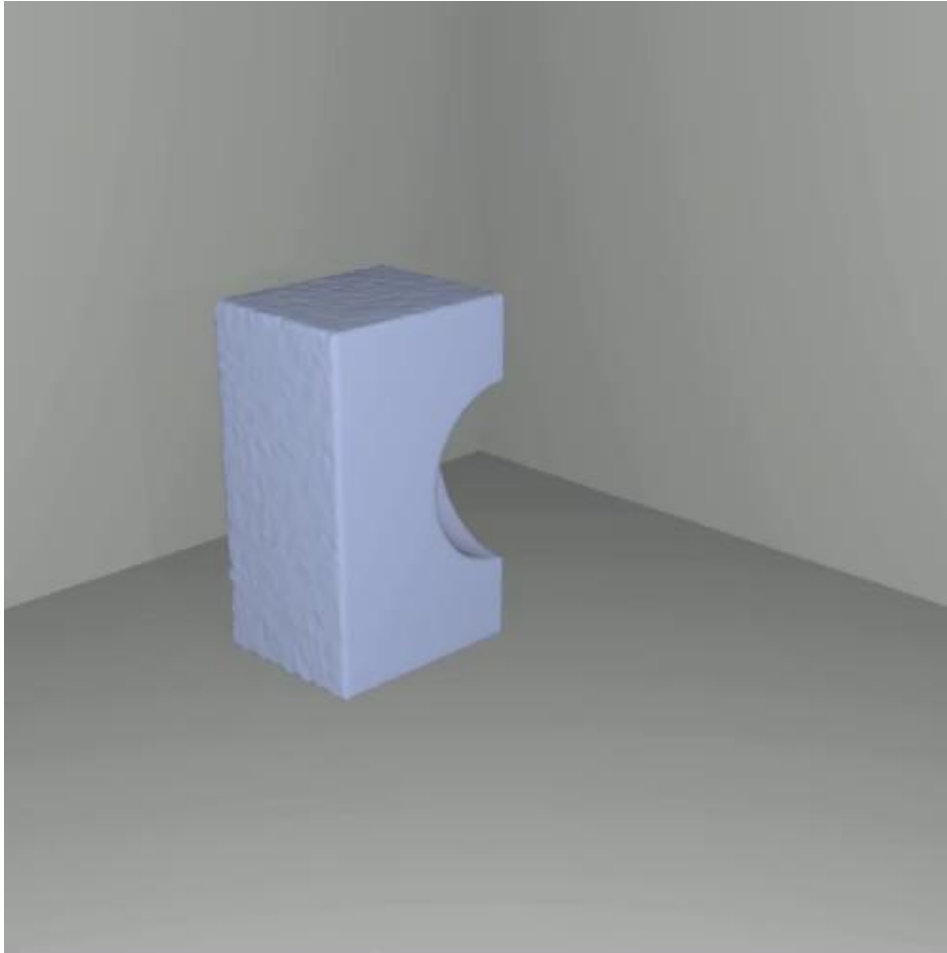
- Efficient
- Accurate
- Handles merging/splitting (topology changes)
- Conserves volume
- Retains small features
- Smooth surface for rendering
- Provides convenient geometric operations
- Easy to implement...

Very hard (impossible?) to do all of these at once.

Surface Tracking Options

1. Particles
2. Level sets
3. Volume-of-fluid (VOF)
4. Triangle meshes
5. Hybrids (many of these)

Particles

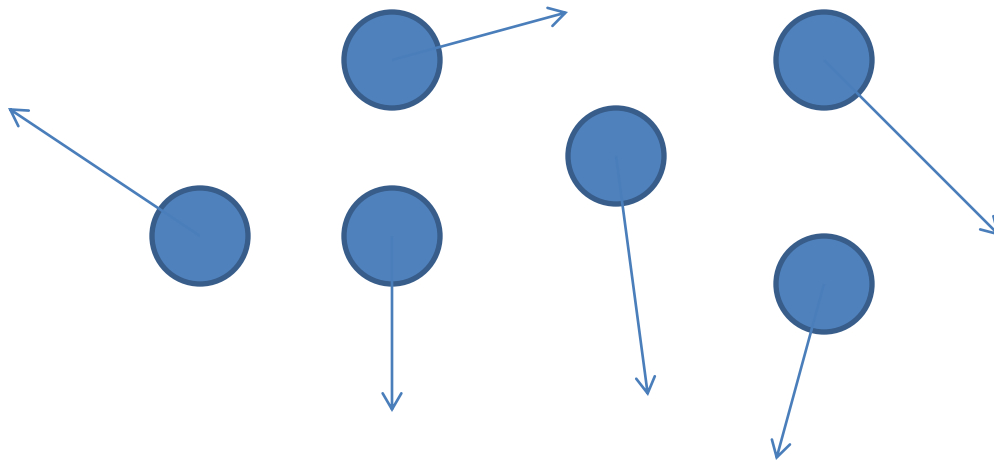


[Zhu & Bridson 2005]

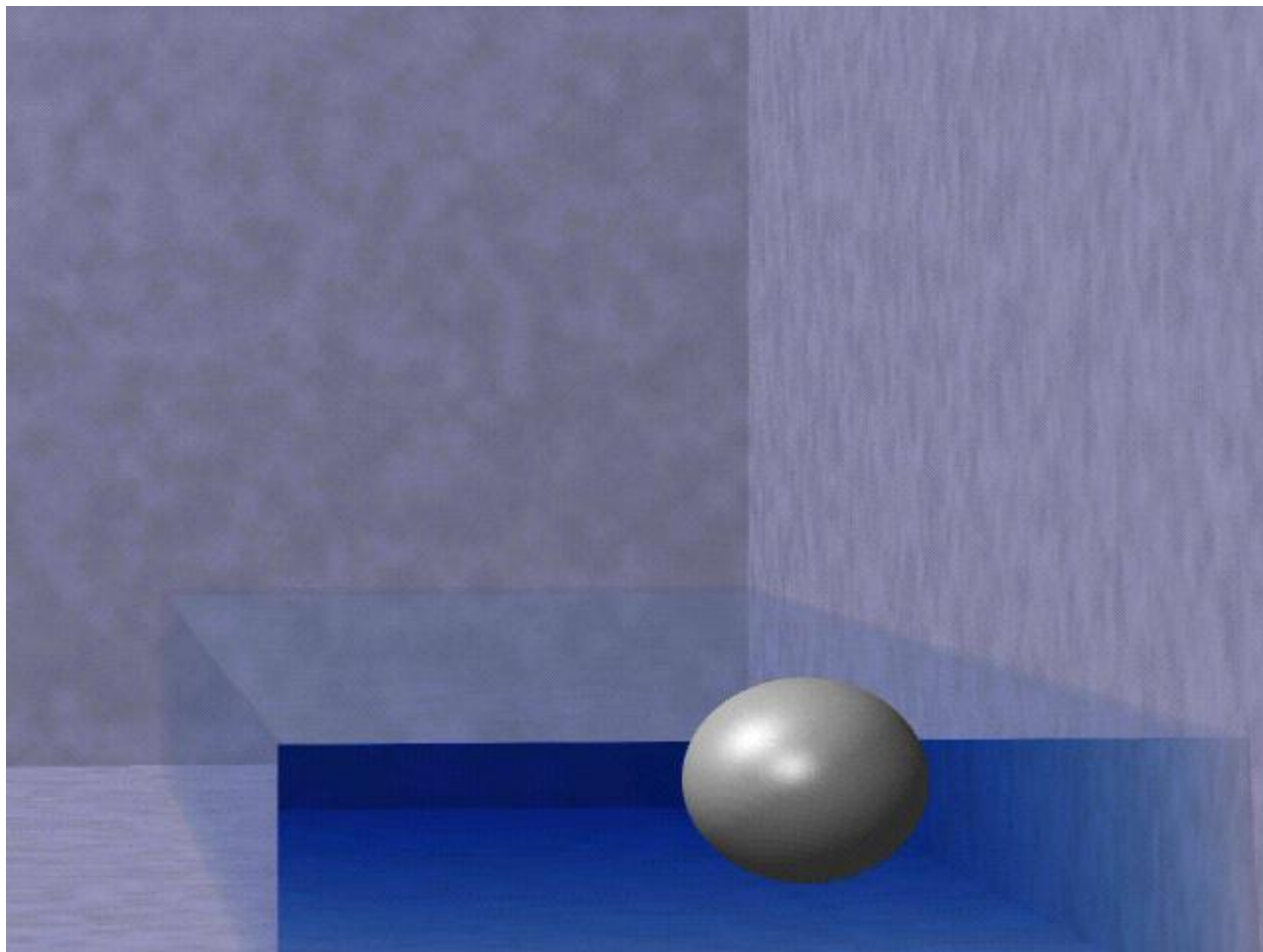
Particles

Perform passive Lagrangian advection on each particle.

Need to reconstruct a surface, as for SPH.



Level sets

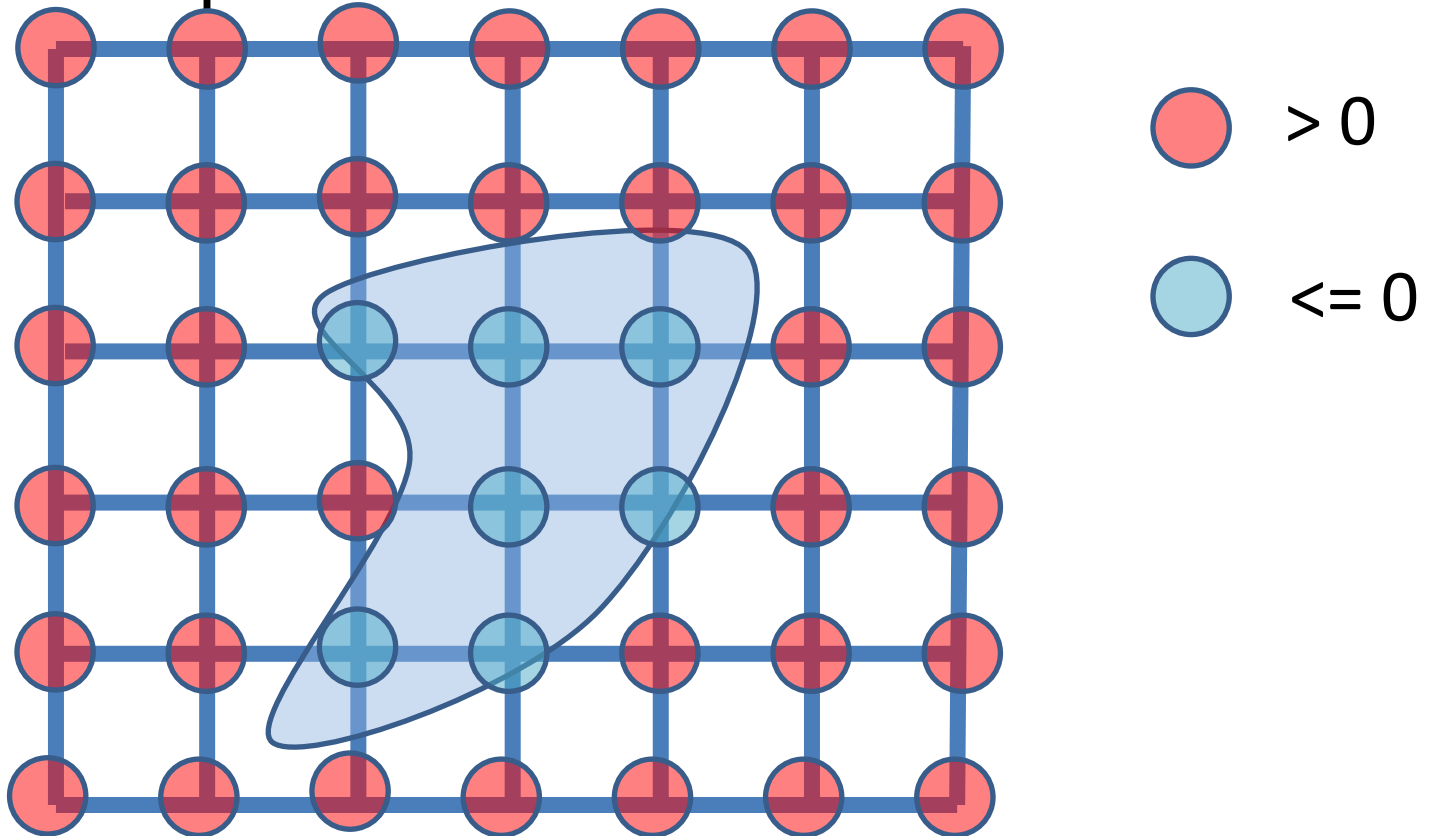


[Losasso et al. 2004]

Level sets

Each grid point stores *signed* distance to the surface (inside ≤ 0 , outside > 0).

Surface is interpolated zero isocontour.



Volume of fluid

Thin Surface Fluid Animation

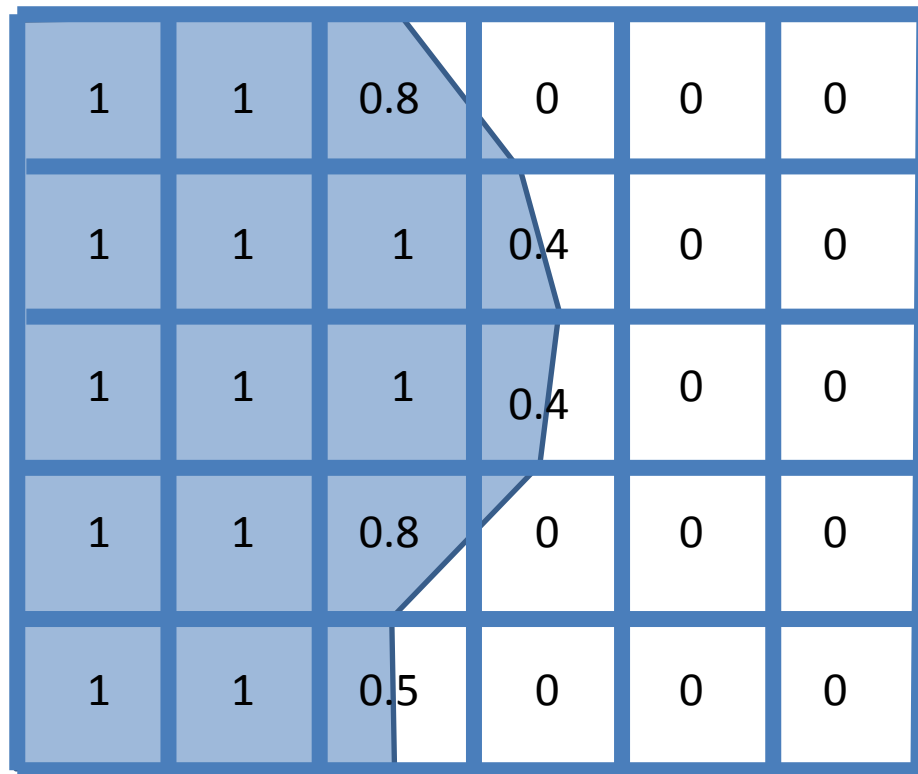
Mass Density Resolution 128^3

Fluid Solver Resolution 64^3

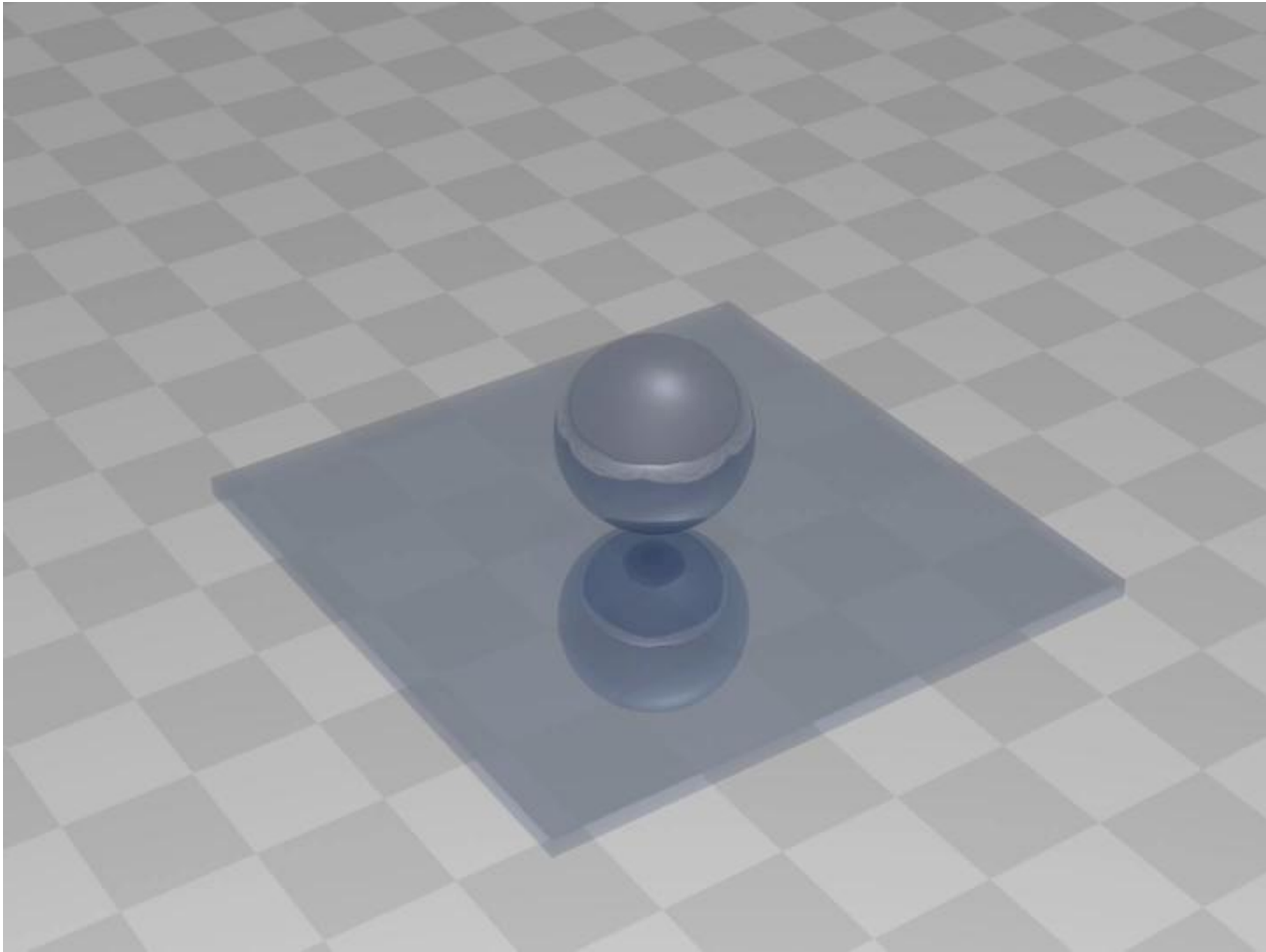
Volume-Of-Fluid

Each cell stores fraction $f \in [0,1]$ indicating how empty/full it is.

Surface is transition region, $f \approx 0.5$.



Meshes

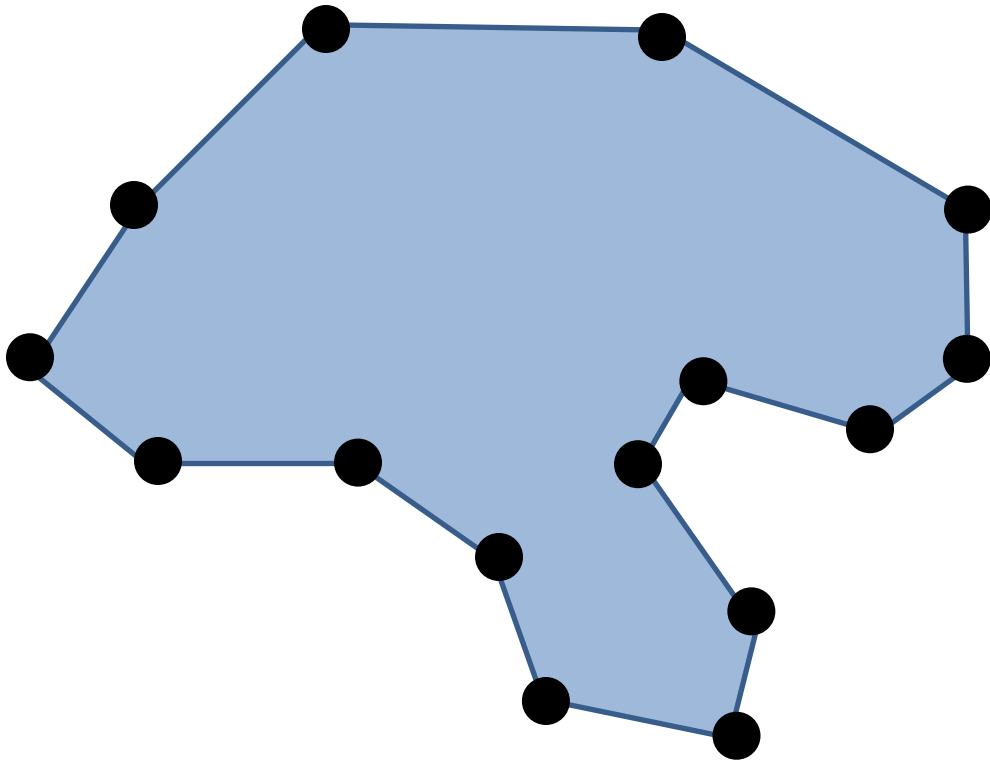


[Brochu et al 2010]

Meshes

Store a triangle mesh.

Advect its vertices, and correct for collisions.



Reference Material

SIGGRAPH course notes: Fluid Simulation for Computer Animation

- <http://www.cs.ubc.ca/~rbridson/fluidsimulation/>

Basics:

- Stable Fluids (Stam 1999)
 - <http://www.dgp.toronto.edu/people/stam/reality/Research/pdf/ns.pdf>
- Practical Animation of Liquids (Foster & Fedkiw 2001)
 - <http://physbam.stanford.edu/~fedkiw/papers/stanford2001-02.pdf>

High Viscosity Liquids:

- Melting and Flowing (Carlson et al. 2003)
 - <http://www.cc.gatech.edu/~turk/melting/melting.html>
- Accurate Viscous Free Surfaces... (Batty & Bridson 2008)
 - <http://www.cs.ubc.ca/~rbridson/docs/batty-sca08-viscosity.pdf>

Reference Material

Better advection:

- Visual Simulation of Smoke (Fedkiw et al. 2001)
 - <http://physbam.stanford.edu/~fedkiw/papers/stanford2001-01.pdf>
- An Unconditionally Stable MacCormack Method (Selle et al. 2006)
 - <http://physbam.stanford.edu/~fedkiw/papers/stanford2006-09.pdf>
- Animating Sand as a Fluid (Zhu & Bridson 2005)
 - <http://www.cs.ubc.ca/~rbridson/docs/zhu-siggraph05-sandfluid.pdf>

Better incompressibility:

- Using the particle levelset method and a second order accurate pressure boundary condition for free surface flows (Enright et al. 2003)
 - <http://physbam.stanford.edu/~fedkiw/papers/stanford2003-03.pdf>
- A fast variational framework for accurate solid-fluid coupling (Batty et al. 2007)
 - http://www.cs.ubc.ca/nest/imager/tr/2007/Batty_VariationalFluids/

Reference Material

Surface Tracking:

- A Fast and Accurate Semi-Lagrangian Particle level set method (Enright et al. 2005)
 - <http://physbam.stanford.edu/~fedkiw/papers/stanford2003-10.pdf>
- Physics-Based Topology Changes for Thin Fluid Features (Wojtan et al. 2010)
 - http://pub.ist.ac.at/group_wojtan/thin_fluid_features/thin_fluid_features.html
- Reconstructing Surfaces of Particle-Based Fluids using Anisotropic Kernels (Yu & Turk 2010)
 - http://www.cc.gatech.edu/~turk/my_papers/sph_surfaces.pdf
- Robust Topological Operations for Dynamic Explicit Surfaces (Brochu & Bridson 2009)
 - <http://www.cs.ubc.ca/labs/imager/tr/2009/eltopo/eltopo.html>

Disclaimer: This is definitely not an exhaustive list!