



COL781: Computer Graphics

# 39. Fluid Simulation

# Recap: Elastic solids

## Mass-spring systems

Degrees of freedom:  $\mathbf{q} = (\mathbf{x}_1, \mathbf{x}_2, \dots, \mathbf{x}_n)$

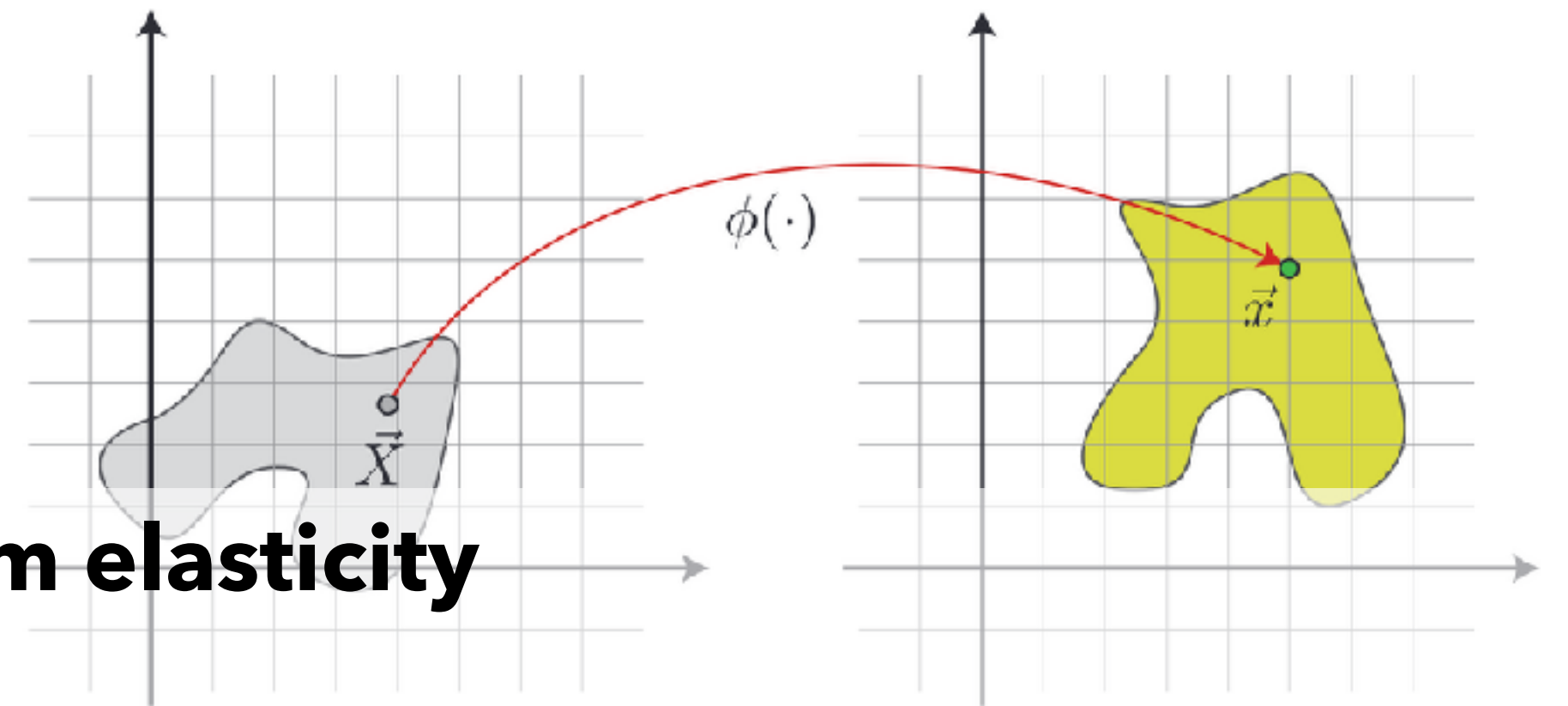
Deformed shape of one spring:  $\mathbf{x}_{ij} = \mathbf{x}_i - \mathbf{x}_j$

$$\text{Strain: } \varepsilon = \frac{\|\mathbf{x}_{ij}\|}{\|\mathbf{X}_{ij}\|} - 1$$

Spring energy:  $U_{ij} = \frac{1}{2} k_s \varepsilon \|\mathbf{X}_{ij}\|$

Total internal energy:  $U = \sum U_{ij}$

$$\text{Force on } i\text{th particle: } \mathbf{f}_i = -\frac{\partial U}{\partial \mathbf{x}_i} = -\sum \frac{\partial U_{ij}}{\partial \mathbf{x}_i}$$



## Continuum elasticity

Degrees of freedom:  $\varphi : \mathbf{X} \rightarrow \mathbf{x}$

Deformation of infinitesimal patch:  $\mathbf{F} = \frac{d\mathbf{x}}{d\mathbf{X}}$

Strain:  $\mathbf{E} = \frac{1}{2} (\mathbf{F}^T \mathbf{F} - \mathbf{I})$

Strain energy density:  $\Psi(\mathbf{E})$

Total internal energy:  $U = \int \Psi(\mathbf{E}) dV$

Generalized force:  $-\frac{\partial U}{\partial \phi}$ ?

# Recap: Elastic solids

## Mass-spring systems

Degrees of freedom:  $\mathbf{q} = (\mathbf{x}_1, \mathbf{x}_2, \dots, \mathbf{x}_n)$

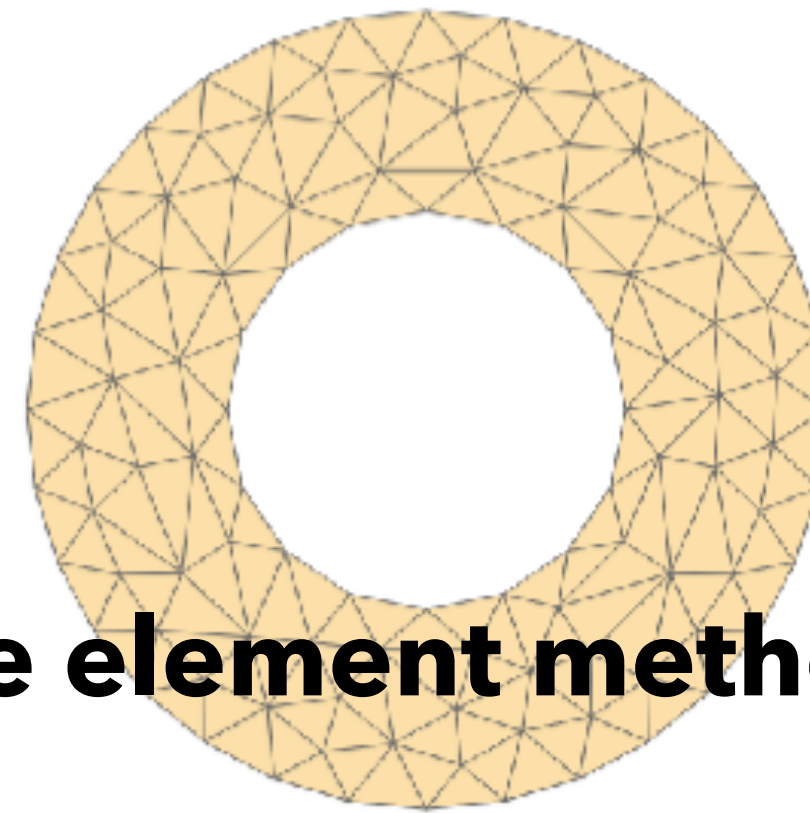
Deformed shape of one spring:  $\mathbf{x}_{ij} = \mathbf{x}_i - \mathbf{x}_j$

$$\text{Strain: } \varepsilon = \frac{\|\mathbf{x}_{ij}\|}{\|\mathbf{X}_{ij}\|} - 1$$

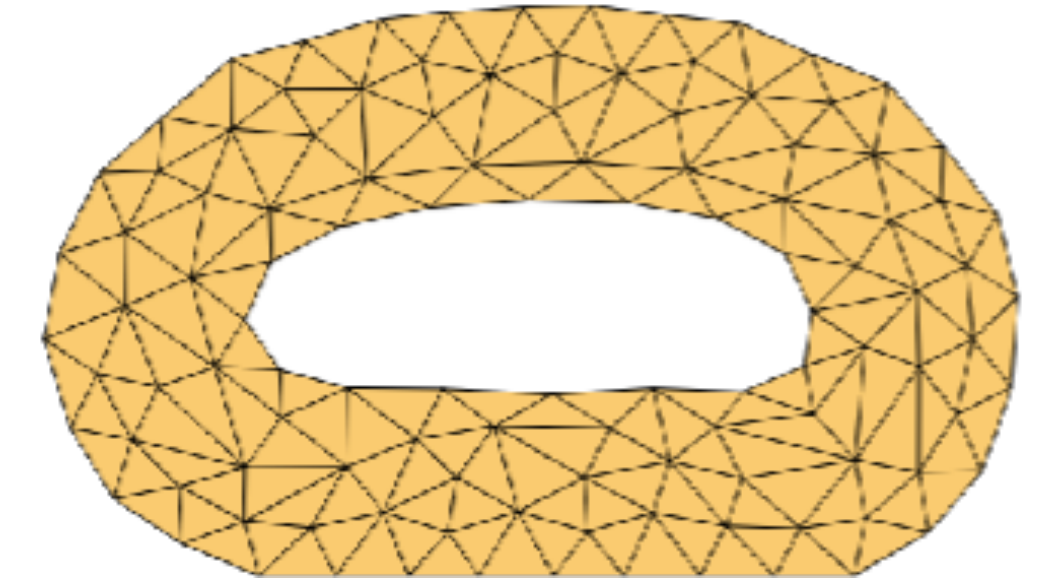
Spring energy:  $U_{ij} = \frac{1}{2} k_s \varepsilon \|\mathbf{x}_{ij}\|$

Total internal energy:  $U = \sum U_{ij}$

$$\text{Force on } i\text{th particle: } \mathbf{f}_i = -\frac{\partial U}{\partial \mathbf{x}_i} = -\sum \frac{\partial U_{ij}}{\partial \mathbf{x}_i}$$



## Finite element method



Degrees of freedom:  $\mathbf{q} = (\mathbf{x}_1, \mathbf{x}_2, \dots, \mathbf{x}_n)$

Deformation of  $j$ th element:  $\mathbf{F}_j = \frac{d\mathbf{x}}{d\mathbf{X}}$

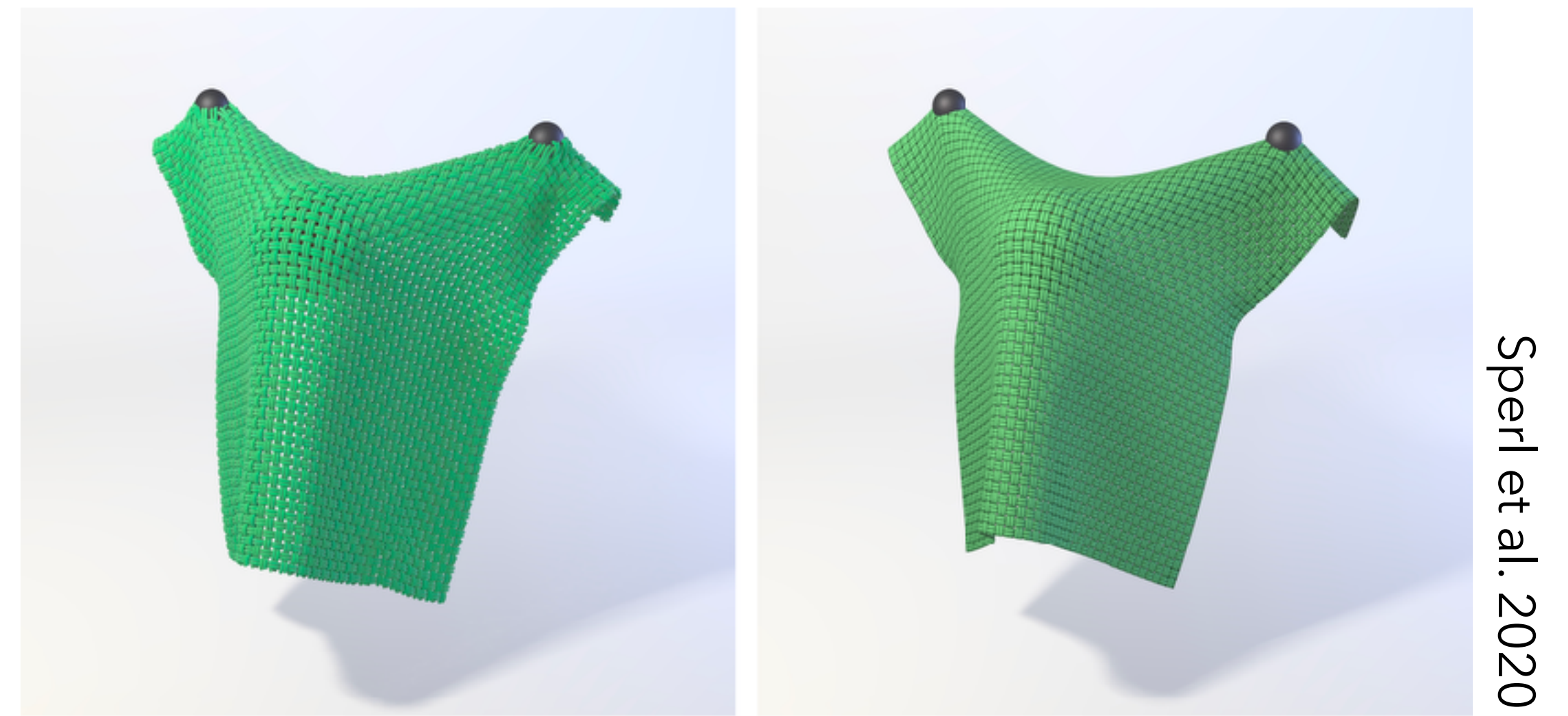
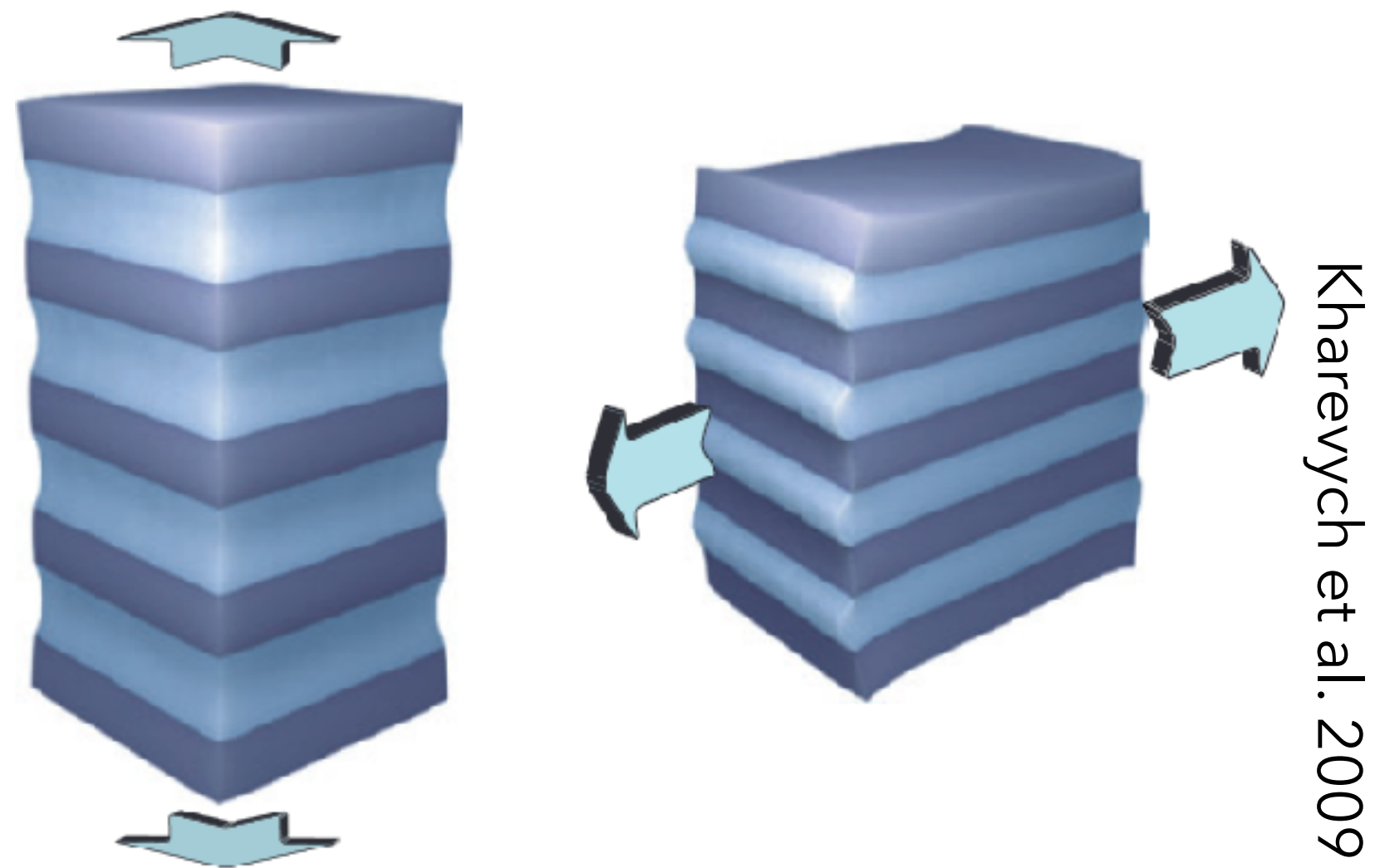
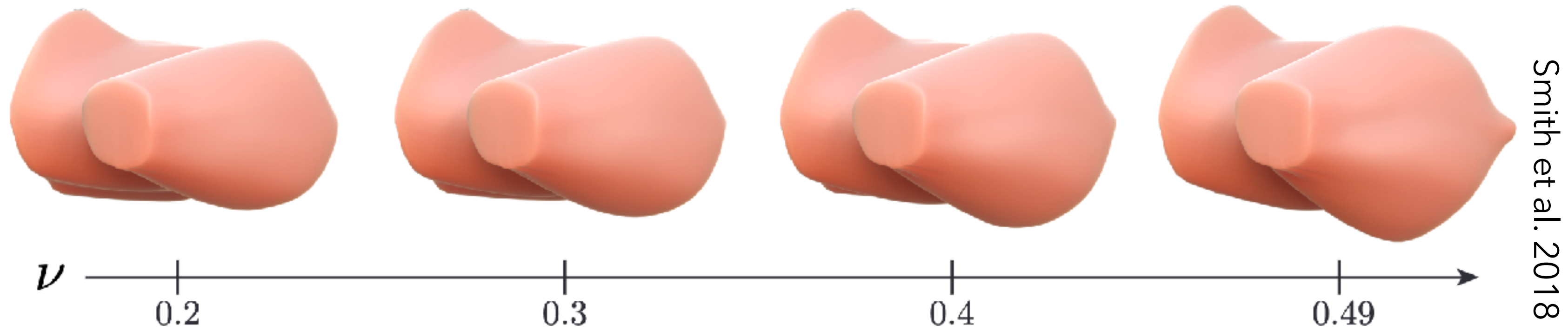
Strain:  $\mathbf{E} = \frac{1}{2} (\mathbf{F}^T \mathbf{F} - \mathbf{I})$

Strain energy density:  $\Psi(\mathbf{E})$

Total internal energy:  $U = \sum \Psi(\mathbf{E}_j) dV_j$

$$\text{Force on } i\text{th particle: } \mathbf{f}_i = -\frac{\partial U}{\partial \mathbf{x}_i} = -\sum \frac{\partial U_j}{\partial \mathbf{x}_i}$$

Choice of strain energy density  $\Psi(\mathbf{E})$  determines material behaviour, including volume preservation (Poisson's ratio), anisotropy, and all other effects



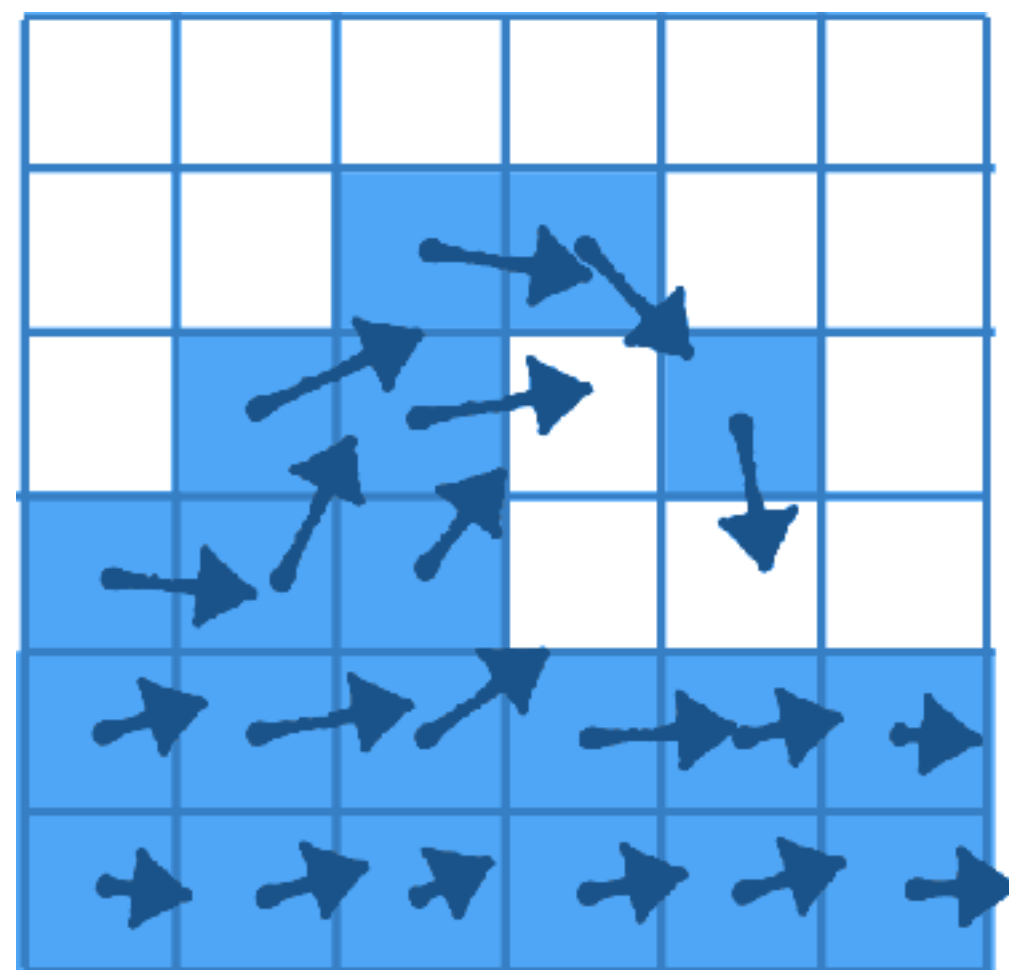
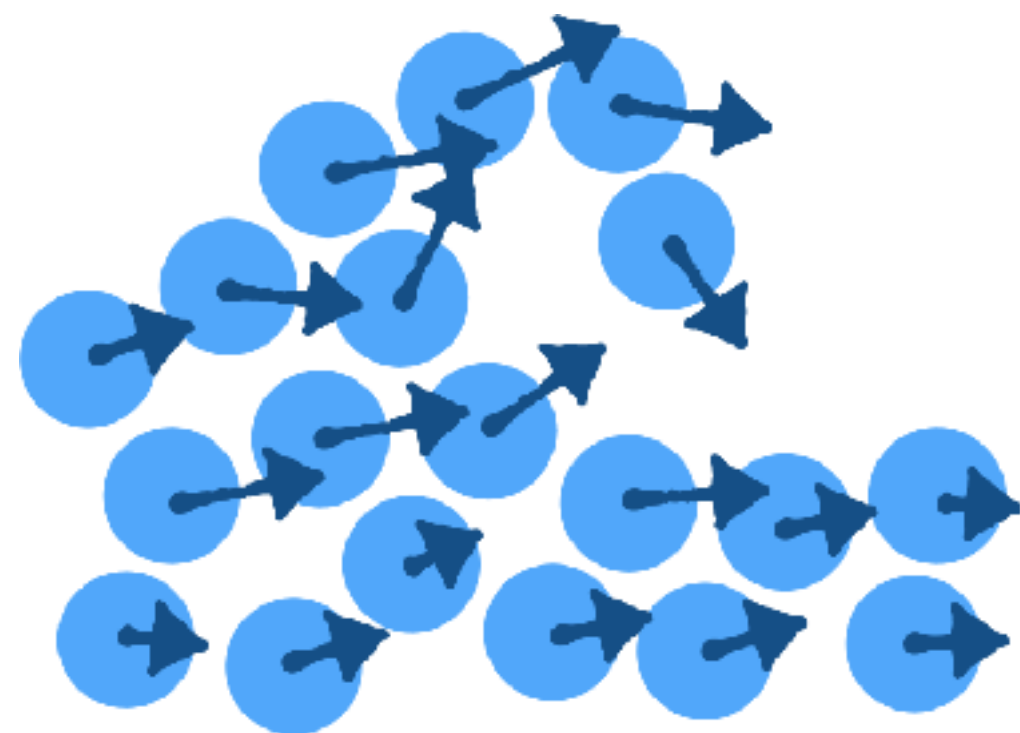
# Fluids

No rest shape, so no reference space  $\mathbf{X}$  needed.

No deformation map  $\mathbf{x}(\mathbf{X})$ , no time derivative  $\mathbf{v}(\mathbf{X}) = \dot{\mathbf{x}}(\mathbf{X})$

Still need  $\mathbf{v}$  as a function of  $\mathbf{x}$  though: the **velocity field**

Can discretize using particles or a grid:



Forces acting on the fluid:

- External forces e.g. gravity

- Pressure  $\mathbf{f}_{\text{pres}} = -\nabla p(\mathbf{x})$

Fluid is pushed away from high pressure towards low pressure

- Viscosity  $\mathbf{f}_{\text{visc}} = \mu \nabla^2 \mathbf{u}(\mathbf{x})$

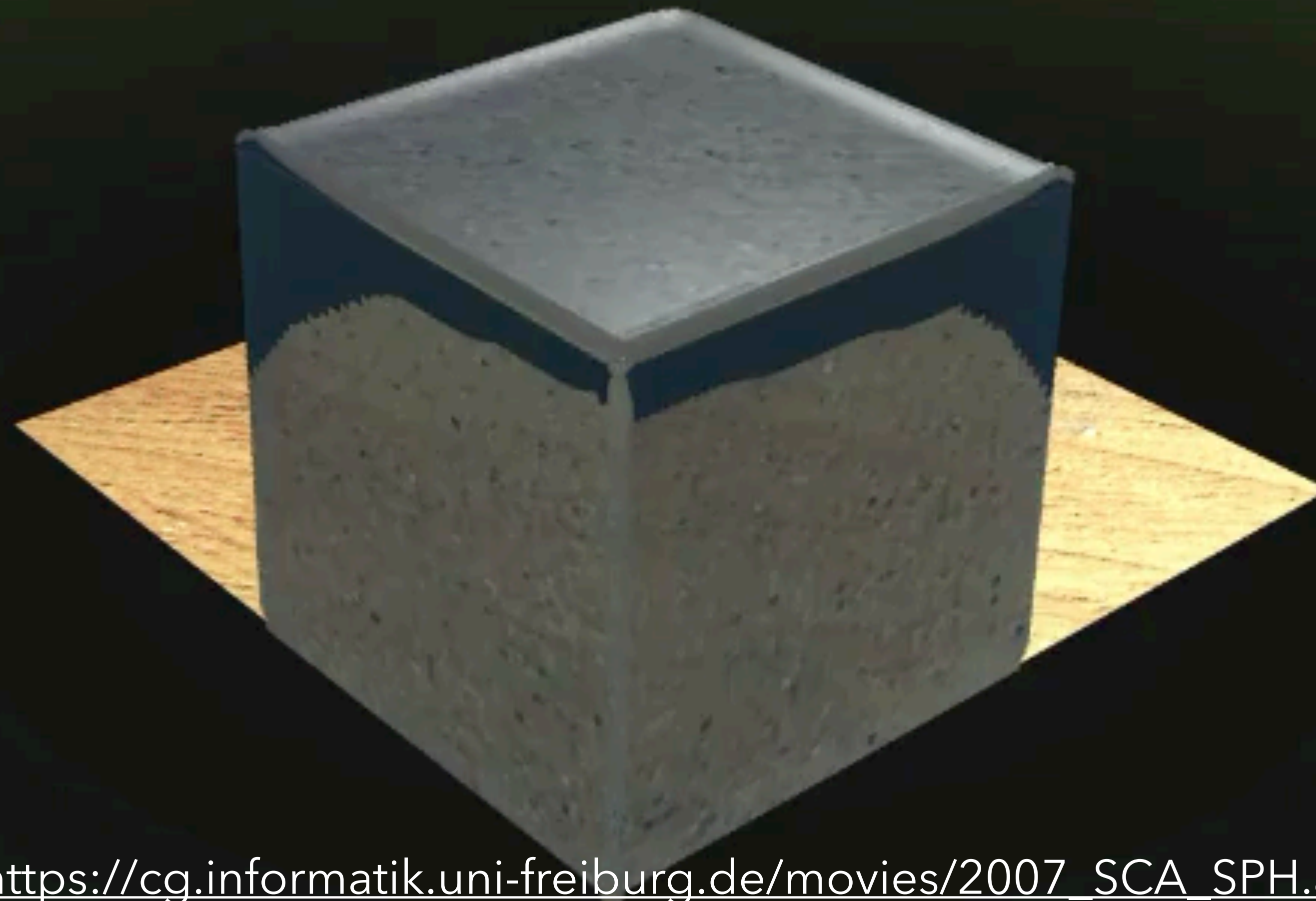
Resists relative motion within the fluid

- ~~Surface tension (out of scope)~~

- ~~Interaction with solids (out of scope)~~

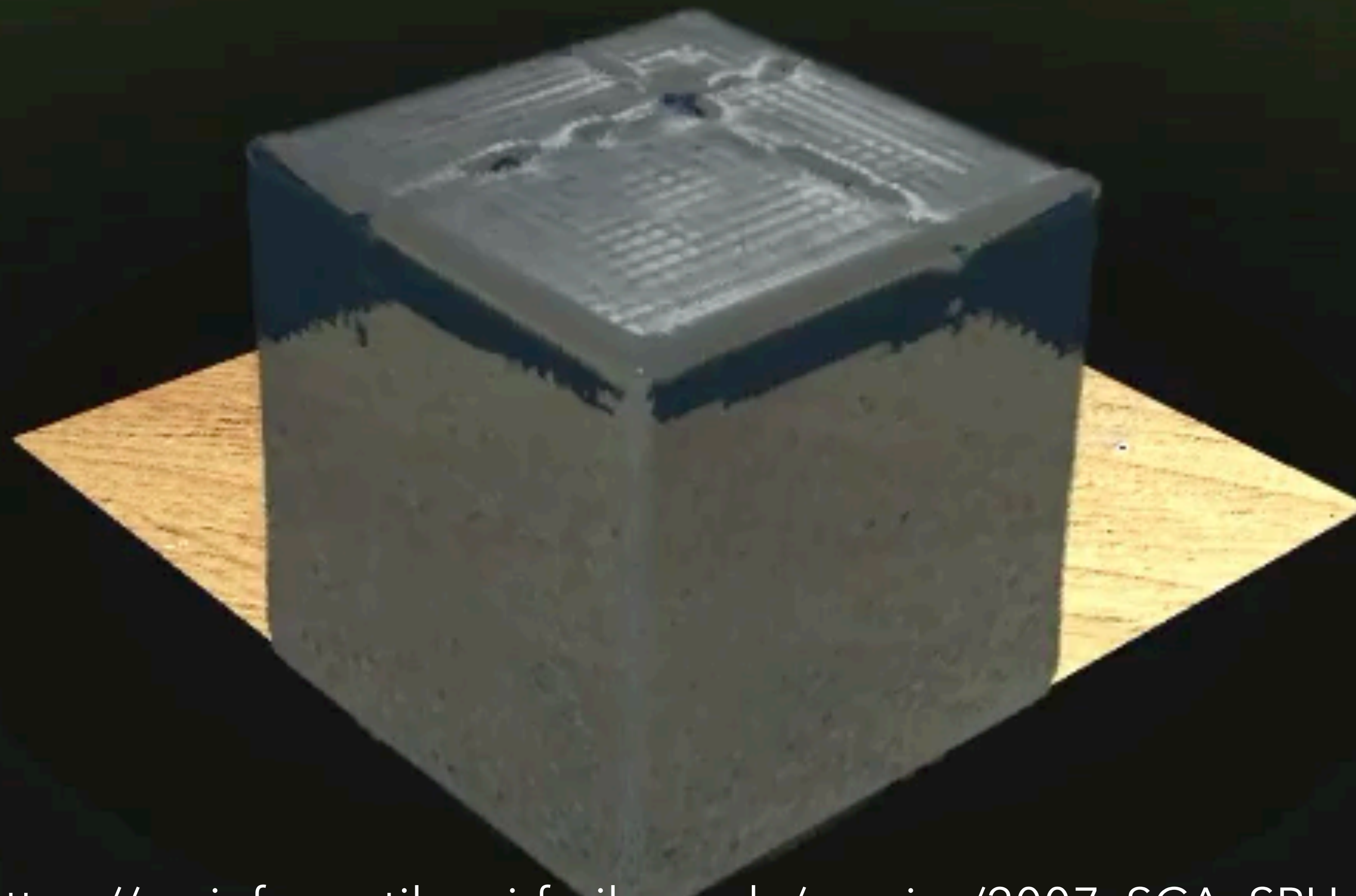


# Pressure as a soft constraint



[https://cg.informatik.uni-freiburg.de/movies/2007\\_SCA\\_SPH.avi](https://cg.informatik.uni-freiburg.de/movies/2007_SCA_SPH.avi)

# Pressure as a harder constraint



[https://cg.informatik.uni-freiburg.de/movies/2007\\_SCA\\_SPH.avi](https://cg.informatik.uni-freiburg.de/movies/2007_SCA_SPH.avi)



# Pressure

**In real life**, pressure is a restoring force that opposes changes in density.

Restoring force → oscillations (sound, shock waves)!

**In simulation**, we'll treat fluid as perfectly incompressible → no oscillations, stable!

Change in volume of any "blob" of fluid should be zero everywhere:

$$(\nabla \cdot \mathbf{u})(\mathbf{x}) = 0$$

Solve for the pressure field  $p$  so that, after applying the pressure force  $-\nabla p(\mathbf{x})$ , the above remains true.

# The Navier-Stokes equations

$$\frac{D\mathbf{u}}{Dt} = \mathbf{f}_{\text{ext}} - \nabla p + \mu \nabla^2 \mathbf{u}$$

Wait, what's  $D/Dt$ ?

- Partial derivative  $\frac{\partial \mathbf{u}(t, \mathbf{x})}{\partial t}$  = time derivative at a fixed point  $\mathbf{x}$
- **Material derivative**  $\frac{D\mathbf{u}(t, \mathbf{x})}{Dt}$  = time derivative seen by point moving with the fluid

Actually 
$$\frac{D\mathbf{u}}{Dt} = \frac{\partial \mathbf{u}}{\partial t} + (\mathbf{u} \cdot \nabla) \mathbf{u}$$



S. Blackaller-Johnson



Burazin

$$\frac{\partial \mathbf{u}}{\partial t} + (\mathbf{u} \cdot \nabla) \mathbf{u} = \mathbf{f}_{\text{ext}} - \nabla p + \mu \nabla^2 \mathbf{u}$$

$$\nabla \cdot \mathbf{u} = 0$$

How to solve this complicated thing?

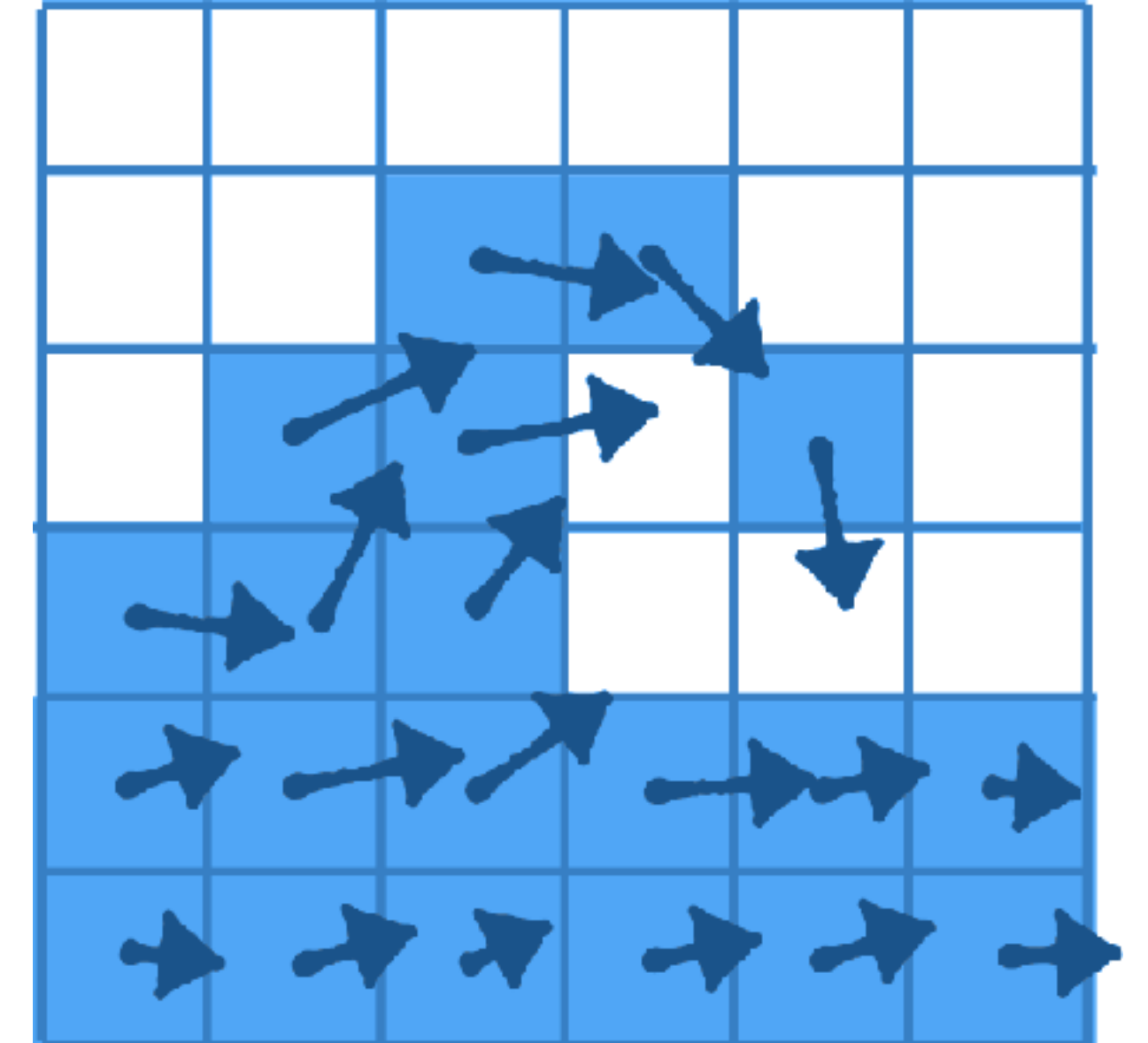
Hard to handle all terms at once! But one at a time is easy: **splitting method**

1. Advection:  $\frac{\partial \mathbf{u}}{\partial t} + (\mathbf{u} \cdot \nabla) \mathbf{u} = 0$

2. External forces:  $\frac{\partial \mathbf{u}}{\partial t} = \mathbf{f}_{\text{ext}}$

3. Viscosity:  $\frac{\partial \mathbf{u}}{\partial t} = \mu \nabla^2 \mathbf{u}$

4. Pressure:  $\frac{\partial \mathbf{u}}{\partial t} = -\nabla p, \nabla \cdot \mathbf{u} = 0$



# Advection

$$\frac{Dq}{Dt} = \frac{\partial q}{\partial t} + (\mathbf{u} \cdot \nabla) q = 0$$

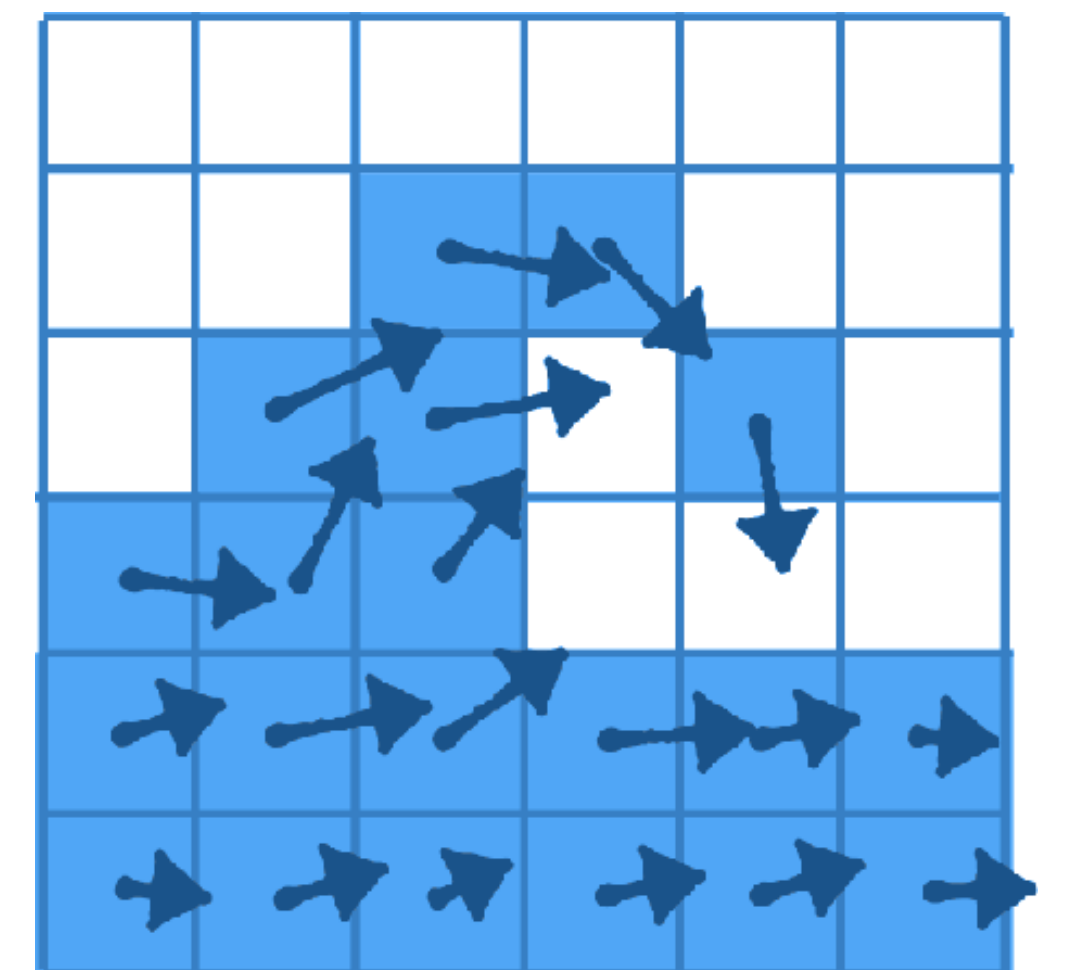
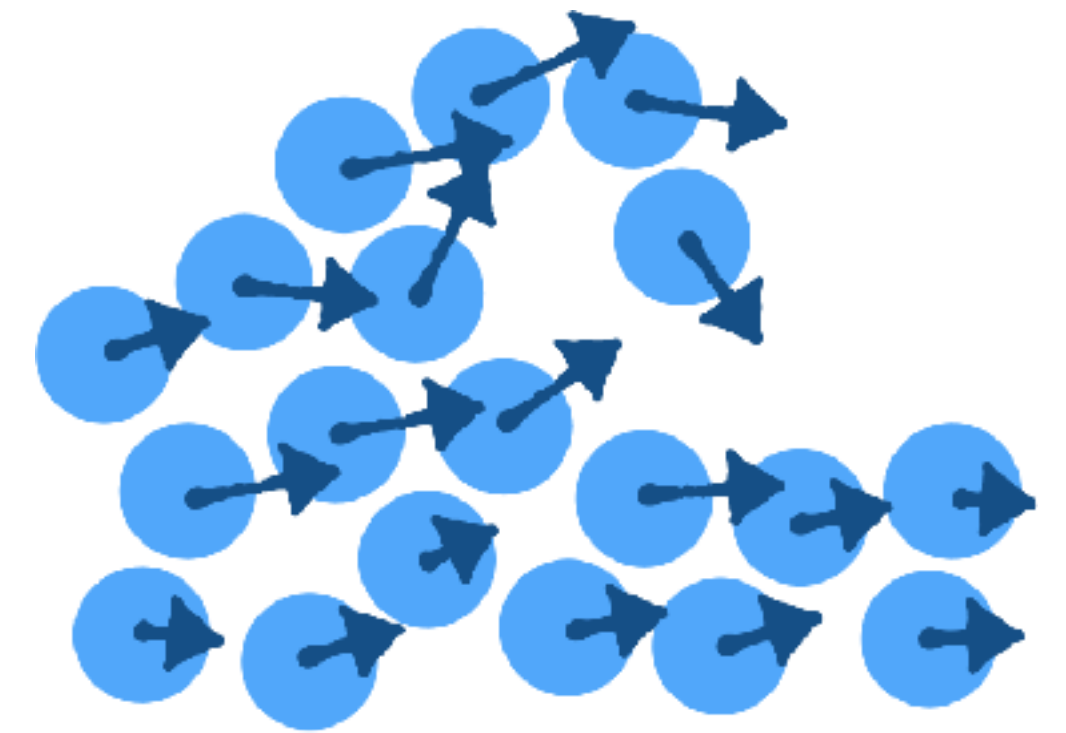
Basically says: **just move everything using the velocity field  $\mathbf{u}$**

Would be easy if we had particles:

$$\mathbf{x}_i^{n+1} = \mathbf{x}_i^n + \mathbf{v}_i^n \Delta t$$

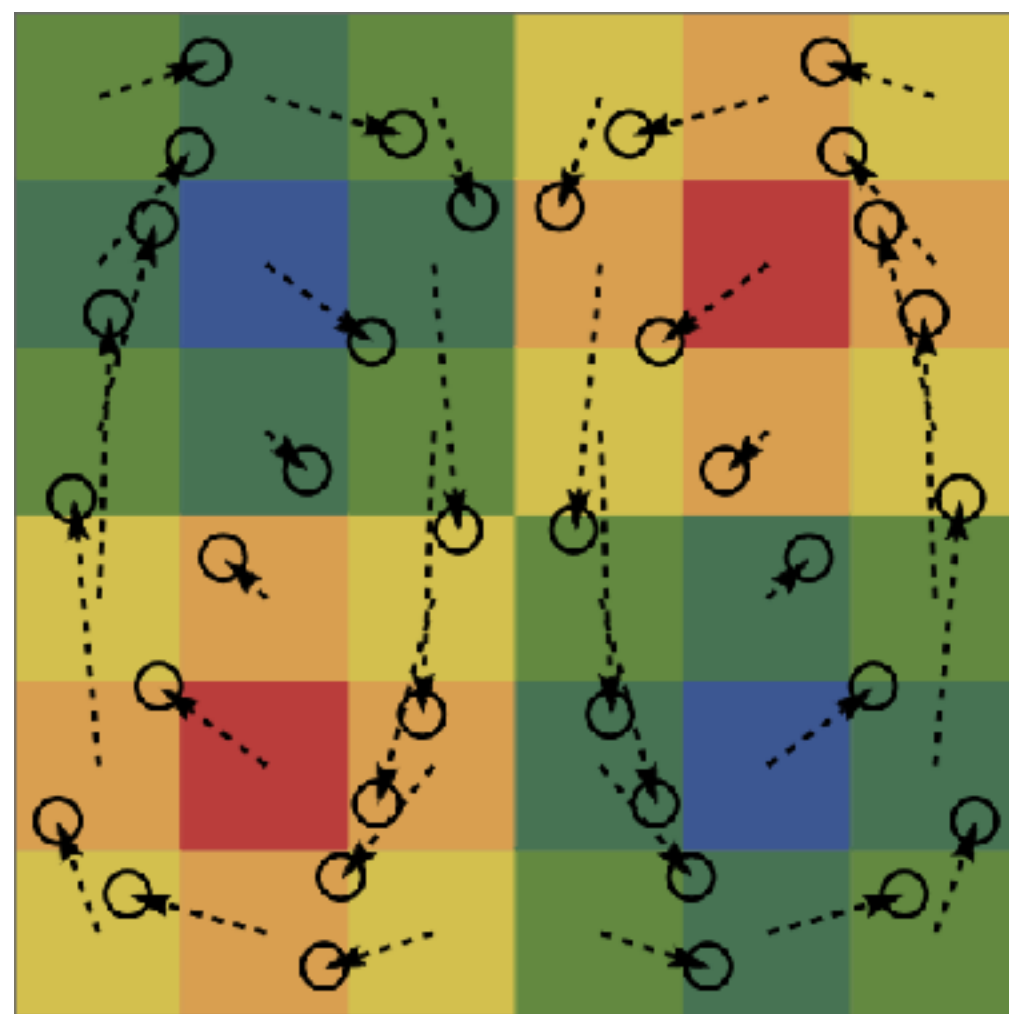
How to get the same effect on a grid?

- Create a temporary particle at each grid cell of  $q^n$ , move it forward for time  $\Delta t$ , write its data to  $q^{n+1}$  at the new position?

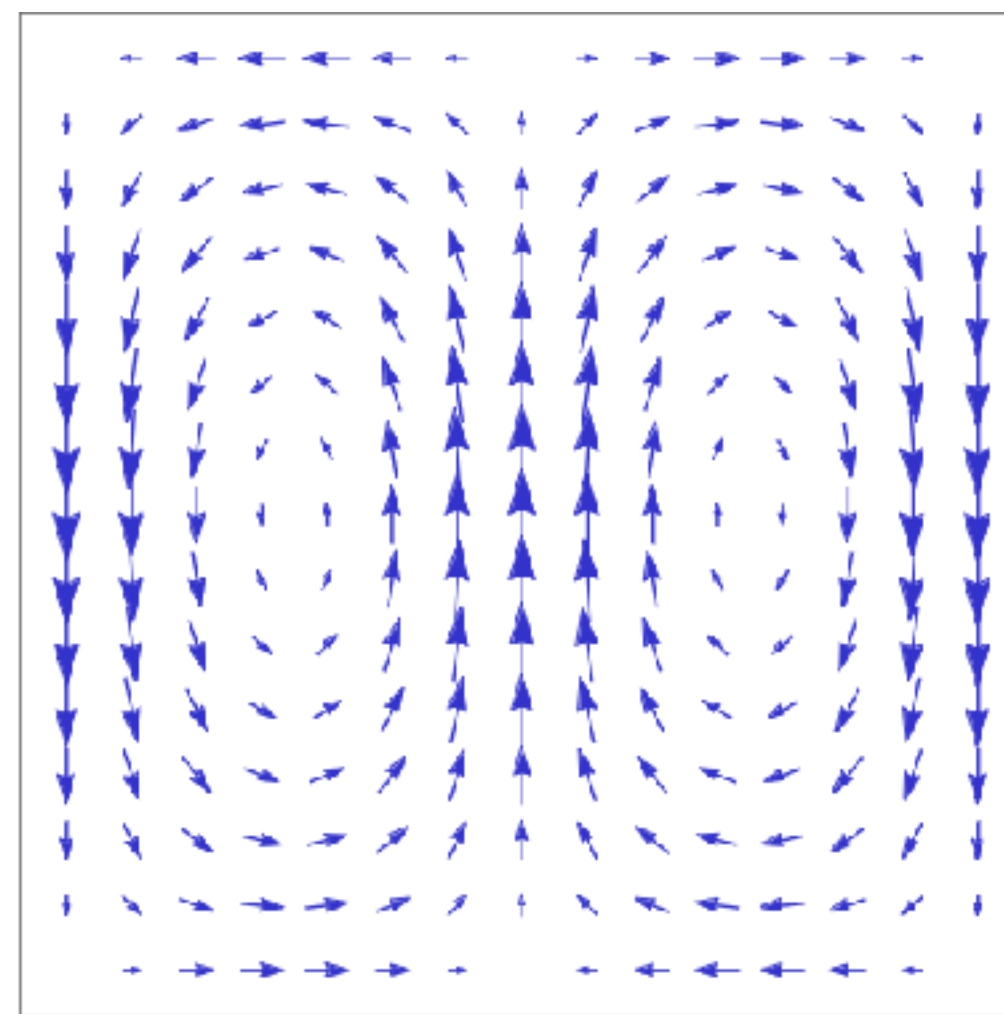


**Semi-Lagrangian advection:** figure out what location the particle **should have started** to land at  $\mathbf{x}_i$ , and pick up the value from there.

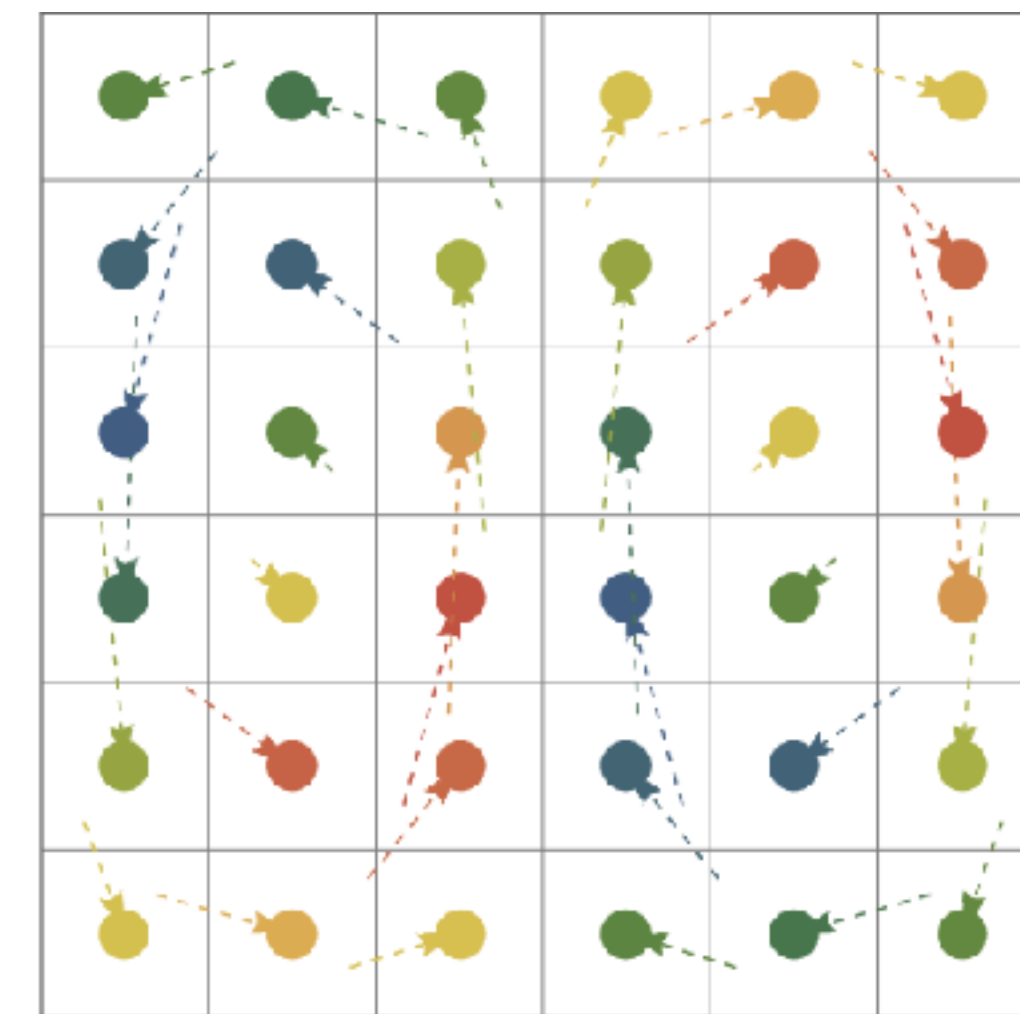
- Create a temporary particle at each grid cell of  $q^{n+1}$
- Trace it **backwards** using current velocity field  $\mathbf{u}$  for time  $-\Delta t$
- Look up interpolated value  $q^n(\mathbf{x})$  and write into original grid cell



$q^n$



$\mathbf{u}$



$q^{n+1}$

# Pressure

$$\frac{\partial \mathbf{u}}{\partial t} = -\nabla p$$
$$\nabla \cdot \mathbf{u} = 0$$

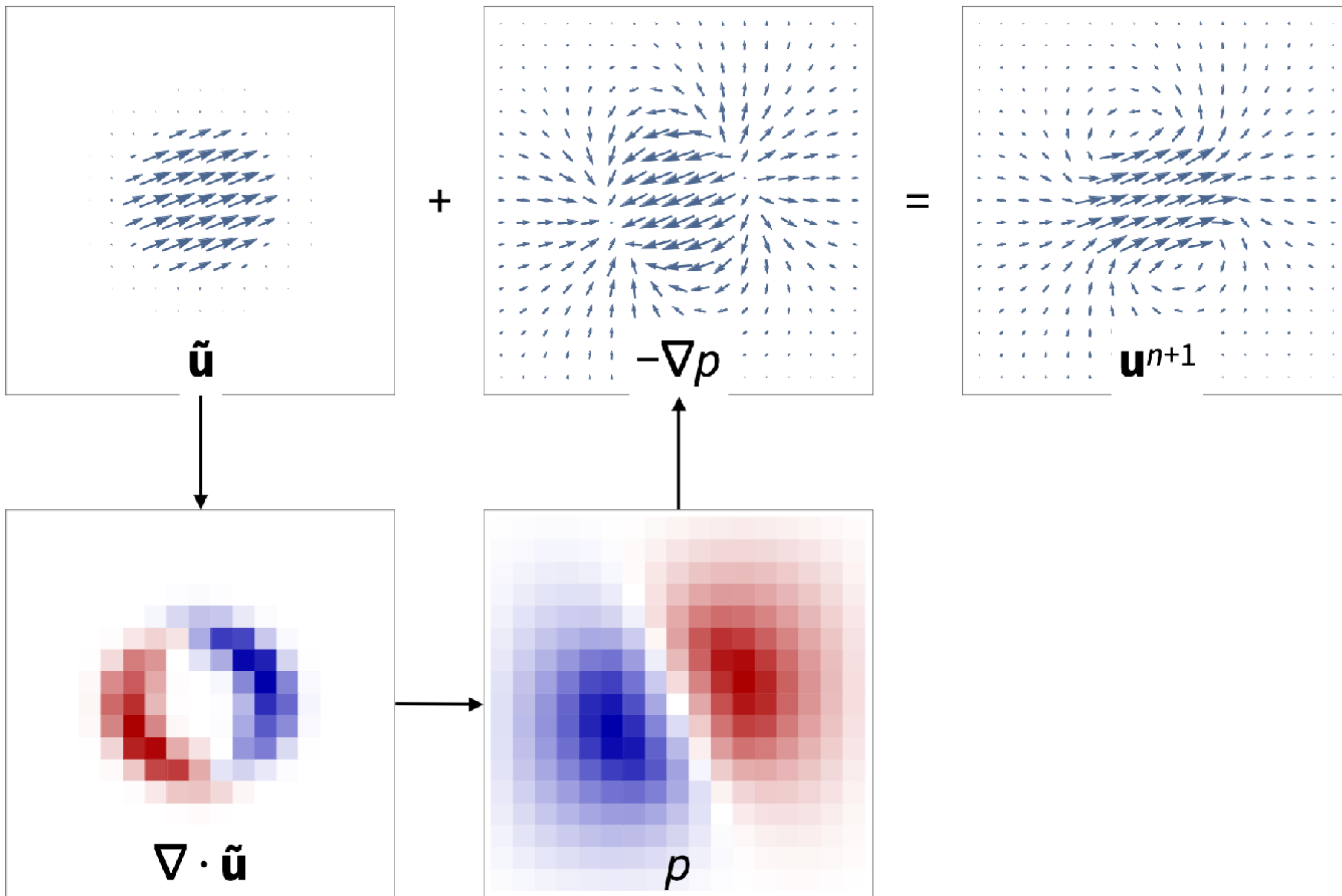
Standard constraint projection strategy:

$$\mathbf{u}^{n+1} = \mathbf{u}^n - \nabla p \Delta t$$
$$\nabla \cdot \mathbf{u}^{n+1} = 0$$

Plug it in and solve for p:

$$\nabla^2 p \Delta t = \nabla \cdot \mathbf{u}^n$$

This is a Laplace problem with nonzero right-hand side, a.k.a. a **Poisson problem**

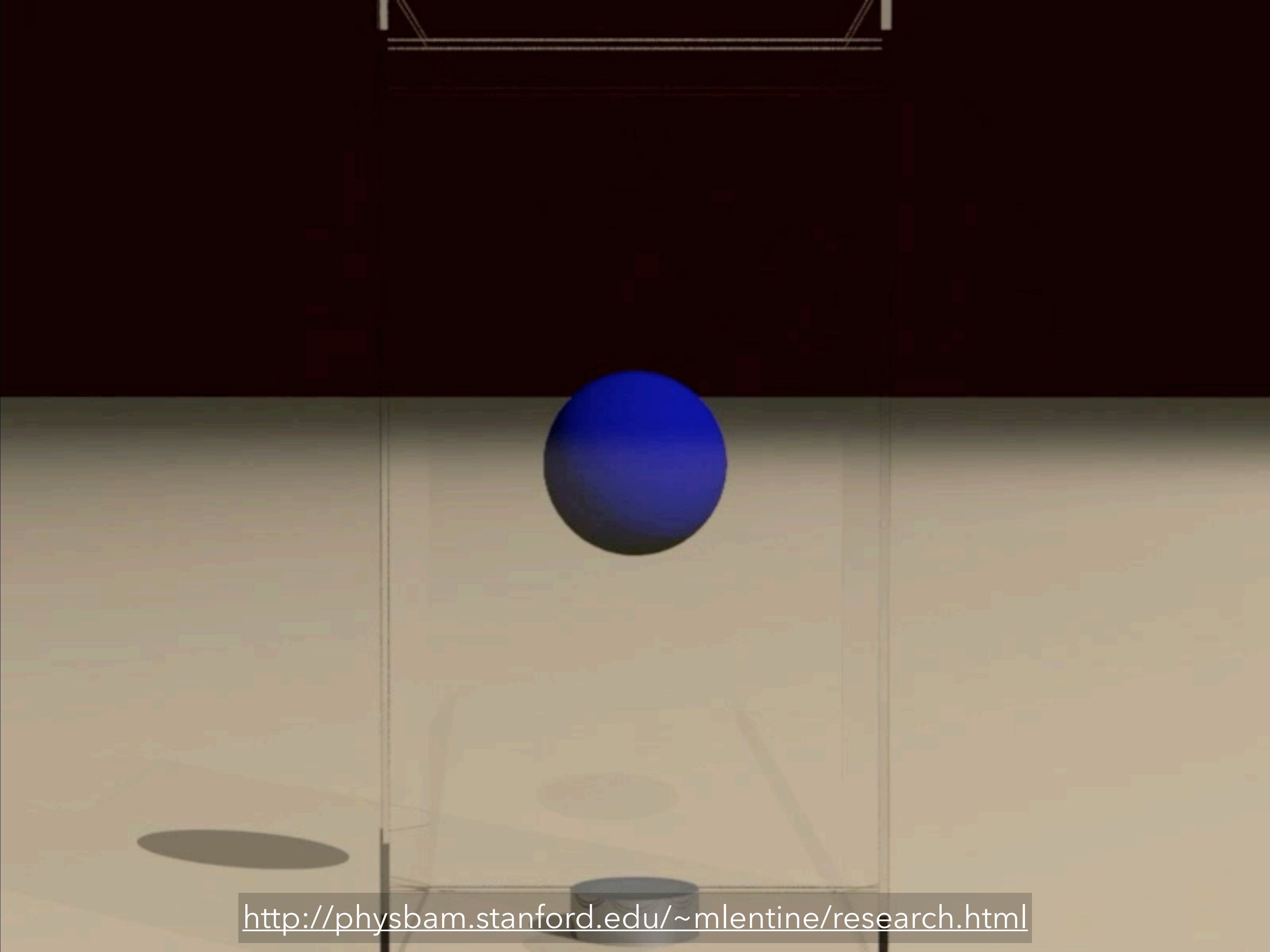


$$\frac{\partial \mathbf{u}}{\partial t} + (\mathbf{u} \cdot \nabla) \mathbf{u} = \mathbf{f}_{\text{ext}} - \nabla p + \mu \nabla^2 \mathbf{u}$$
$$\nabla \cdot \mathbf{u} = 0$$

1. Advection:  $\mathbf{u}^{(1)} = \text{advect}(\mathbf{u}^n, \mathbf{u}^n, \Delta t)$
2. External forces:  $\mathbf{u}^{(2)} = \mathbf{u}^{(1)} + \mathbf{f}_{\text{ext}} \Delta t$
3. Viscosity:  $\mathbf{u}^{(3)} = \mathbf{u}^{(2)} + \mu \nabla^2 \mathbf{u} \Delta t$
4. Pressure:  $\mathbf{u}^{n+1} = \mathbf{u}^{(3)} - \nabla p \Delta t$  so that  $\nabla \cdot \mathbf{u}^{n+1} = 0$

This is the classic **stable fluids** algorithm [Stam 1999]



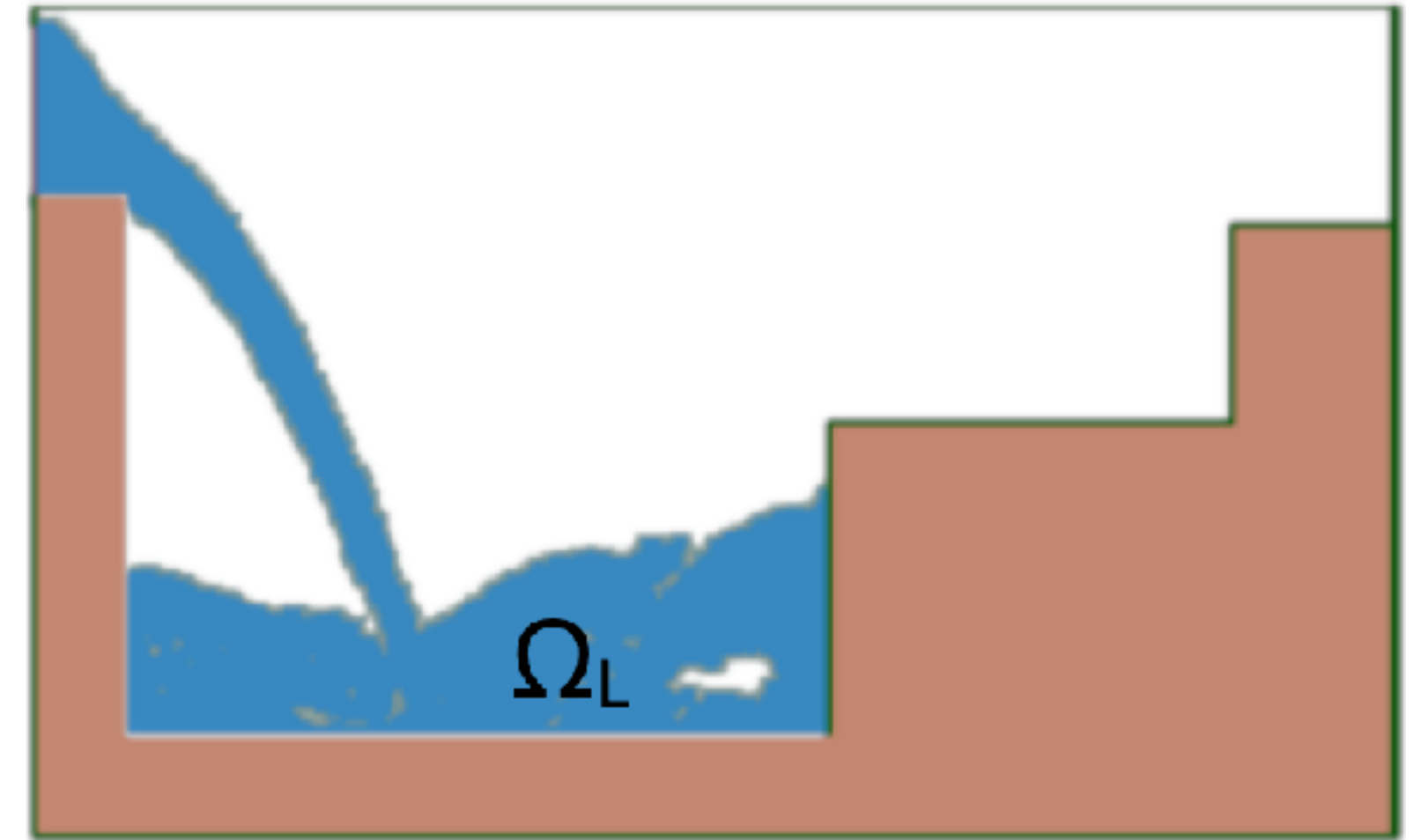


<http://physbam.stanford.edu/~mlentine/research.html>

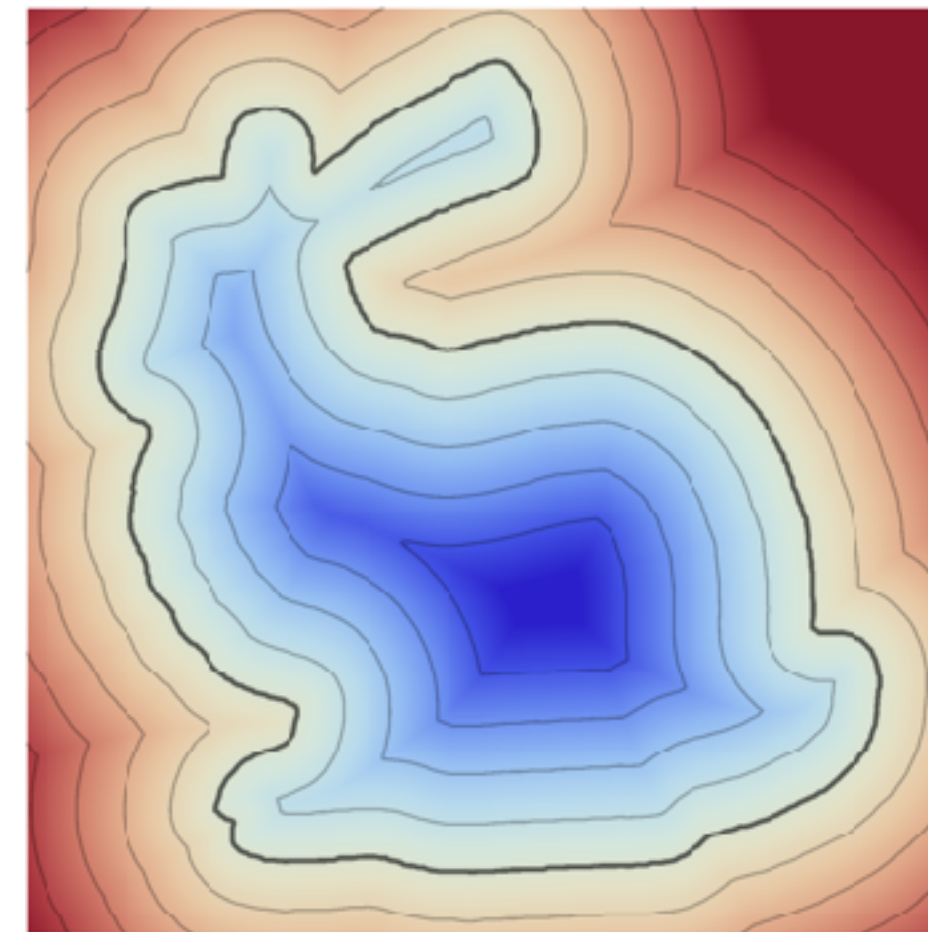
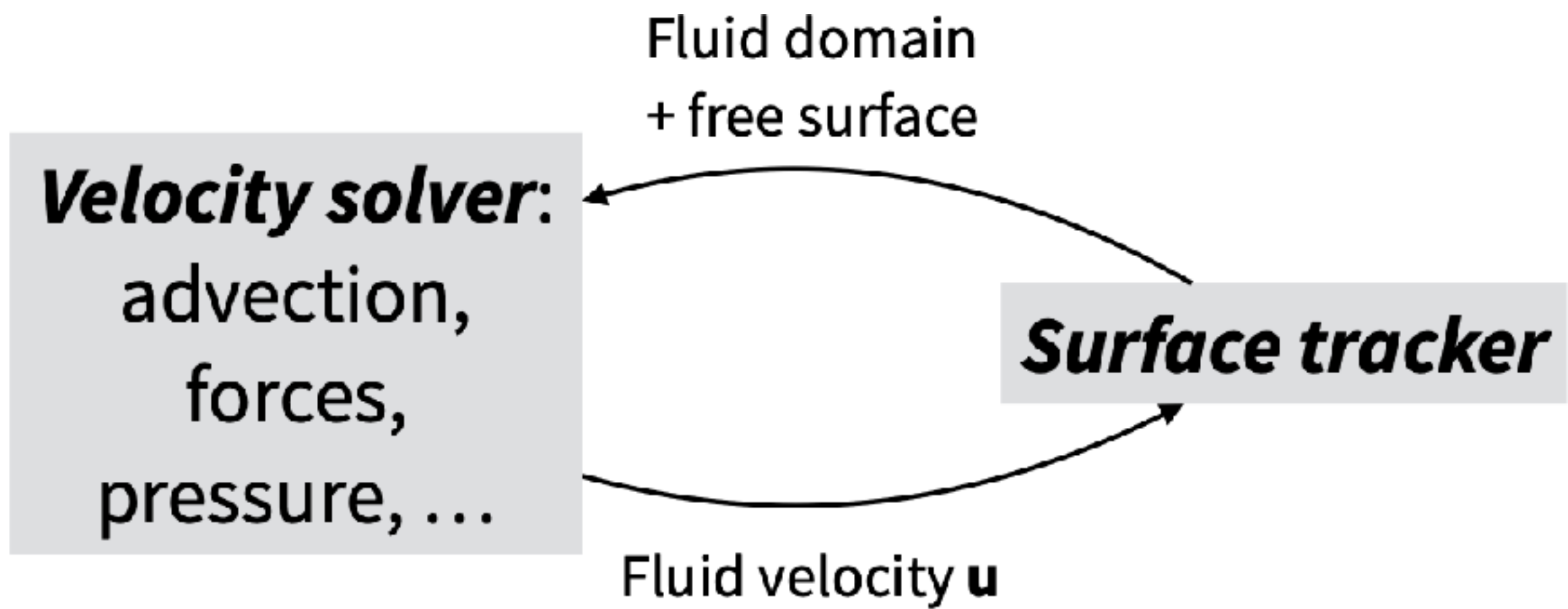
# Liquids

Fluid only occupies a finite region  $\Omega \subset \mathbb{R}^3$

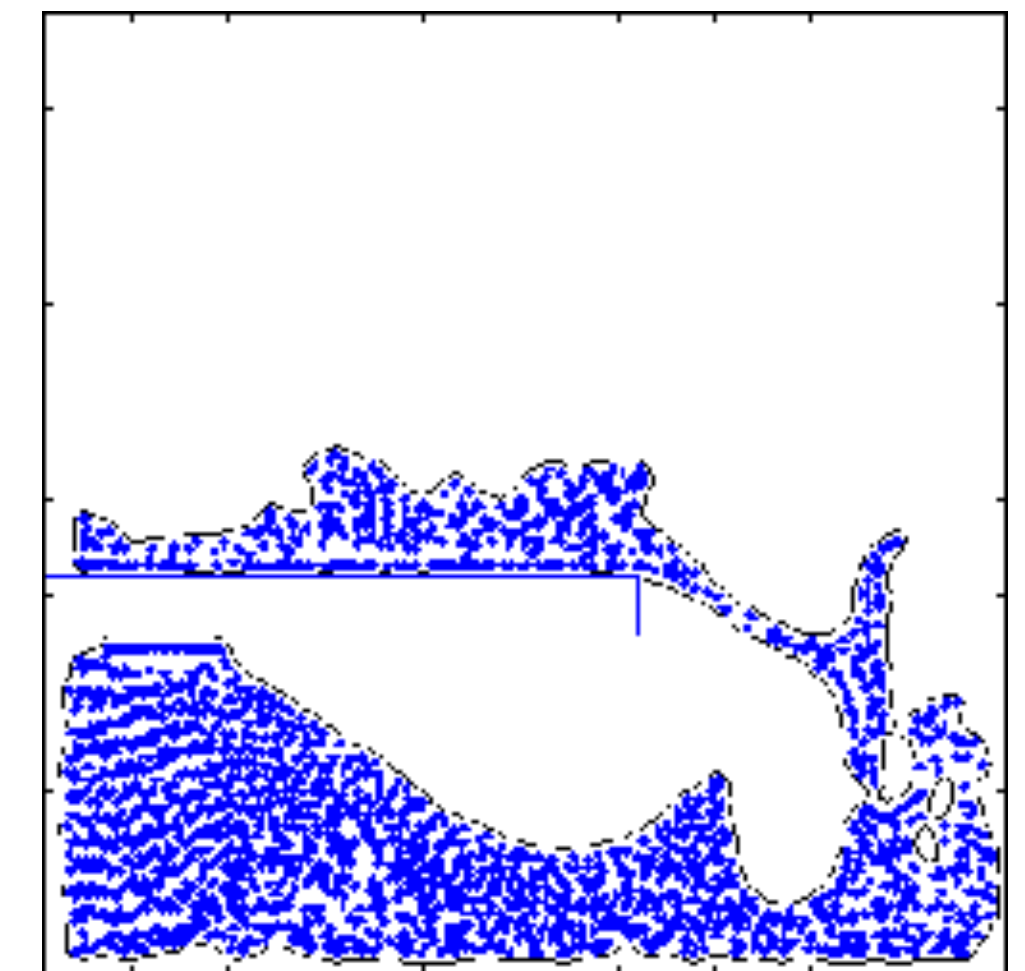
Need a **surface tracking** algorithm to represent  $\Omega$  (usually with an implicit representation)



Foster & Metaxas 1996



Level sets



Particles

# Particle fluids

There are also algorithms for simulating fluids with only particles:  
**smoothed particle hydrodynamics**

Some things become easy:

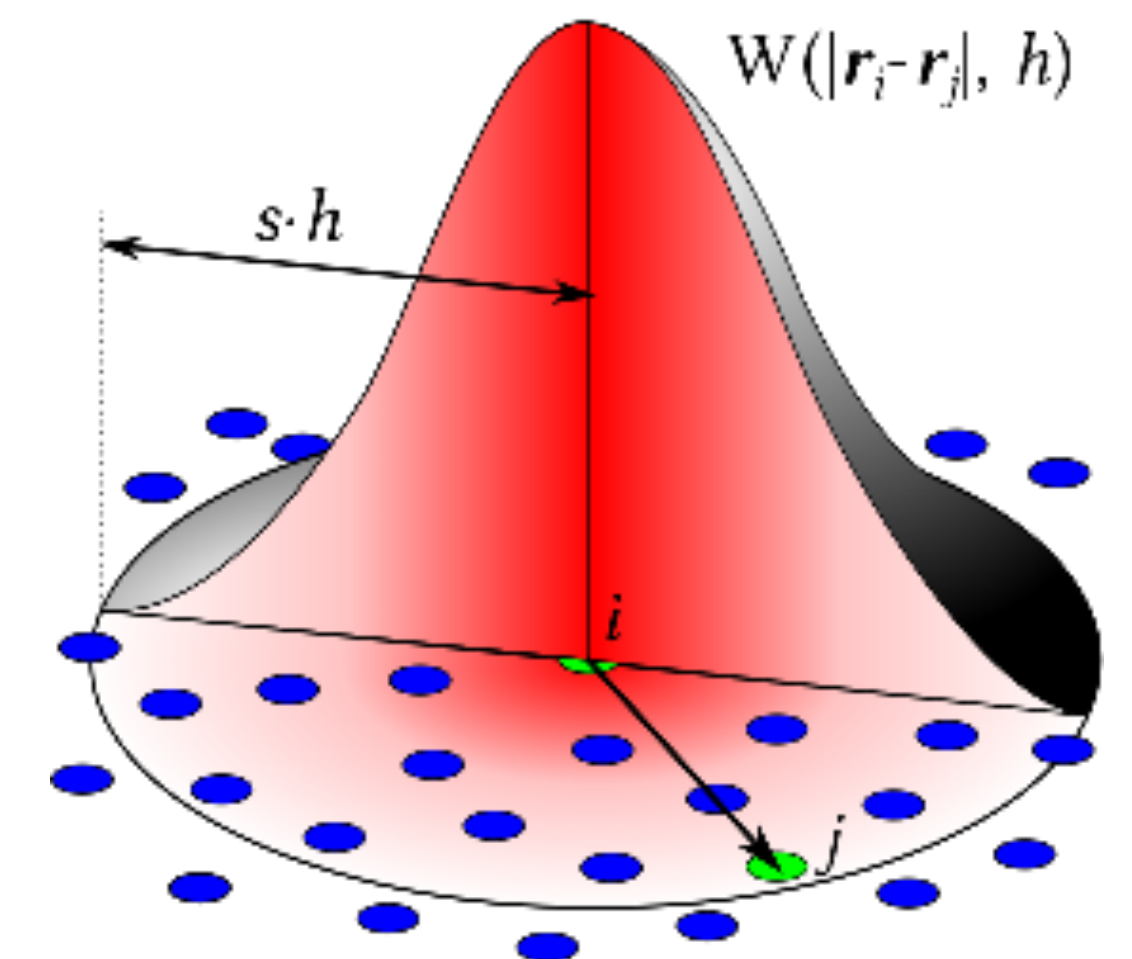
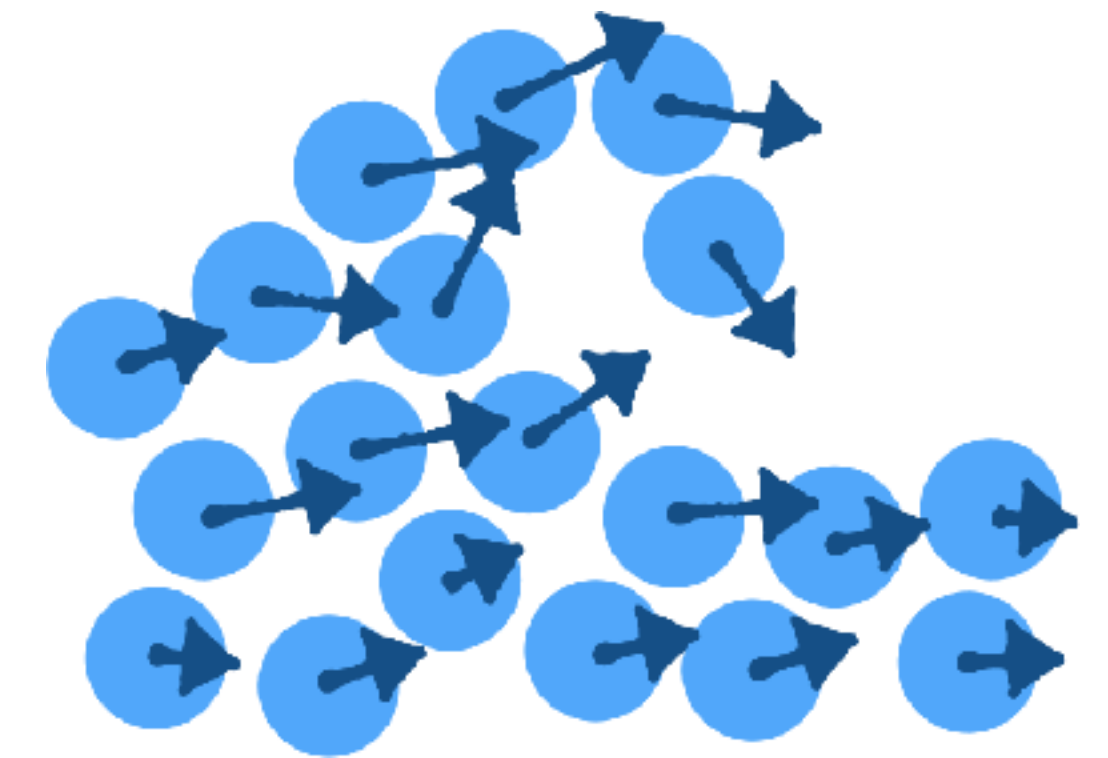
- Advection = just move the particles

Some things become hard:

- How to compute spatial derivatives ( $\nabla \cdot \mathbf{u}$ ,  $\nabla p$ , etc.)?  
Need to do weighted averaging over all nearby particles

Hybrid **particle-in-cell** methods (FLIP, APIC, MPM):

Use particles for advection, use grids for everything else!



# Where to learn more

## **Simulation in general:**

- Witkin & Baraff, *Physically Based Modeling* (2001)
- Bargteil & Shinar, *An Introduction to Physics-Based Animation* (2019)

## **Elastic bodies:**

- Kim & Eberle, *Dynamic Deformables* (2022)

## **Contact handling:**

- Andrews et al., *Contact and Friction Simulation for Computer Graphics* (2022)

## **Fluids:**

- Bridson & Müller-Fischer, *Fluid Simulation for Computer Animation* (2007)