Smoothed Particle Hydrodynamics

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Smoothed Particle Hydrodynamics

- numerical method to simulate fluids (liquids, gases, plasmas)
- idea: represent fluid by moving particles
- first used in astrophysics
- increasingly used in CGI for block-buster movies
- upcoming technology for next-generation computer games

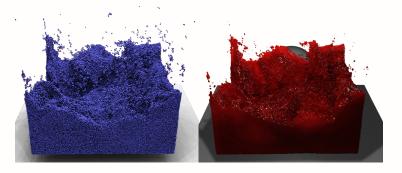


Figure: 1 million particles, rendered in Maya, by Frank Zimmer

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- **5** Approximate $\delta(r-r')$ by $W_h(r-r')$, where

- $W_h \stackrel{*}{\rightharpoonup} \delta$ for $h \to 0$
- W_h radially symmetric
- $W_h \in C_0^\infty$
- supp $W_h \subset B_h(0)$

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Importance of smoothing length

The summation in

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ullet Defining the neighbourhoud of particle i as

$$\mathcal{N}_i := \{1 \leq j \leq N | r_j \in B_h(r_i)\}$$

one can write

$$[A]_{i} = \sum_{i \in \mathcal{N}_{i}} m_{j} \frac{A_{j}}{\rho_{j}} W_{h}(r_{i} - r_{j}).$$

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• Laplacian:

$$(\Delta[A])(r) = \sum_{j=1}^{N} m_j \frac{A_j}{\rho_j} (\Delta W_h)(r - r_j)$$

SPH Field approximation

$$A(r_i) \approx [A]_i := \sum_{j \in \mathcal{N}_i} m_j \frac{A_j}{\rho_j} W_h(r_i - r_j)$$

SPH Gradient approximation:

$$(\nabla A)(r_i) \approx \nabla [A]_i = \sum_{j \in \mathcal{N}_i} m_j \frac{A_j}{\rho_j} (\nabla W_h)(r_i - r_j)$$

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Practical considerations

• Smoothing length *h* proportional to average particle diameter:

$$h \sim rac{1}{\langle
ho
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, where $\langle
ho
angle := rac{1}{n} \sum_{i=1}^N
ho_i$

- Different kernels suitable for different charge densities.
- Kernels not C^{∞} due to performance considerations (Splines!).
- Golden rules of SPH (Monaghan):
 - To find physical interpretation it's always best to assume kernel is Gaussian.
 - Rewrite formulas with mass density inside operators, by making use of

$$\nabla A = \frac{\nabla (A\psi)}{\psi} - \frac{A(\nabla \psi)}{\psi}$$

for positive smooth ψ .

Improved gradients

• Consider A(r) = const. Then $(\nabla A)(r) = 0$, but

$$(\nabla A)(r_i) \approx \nabla [A]_i = \sum_{i \in \mathcal{N}_i} m_j \frac{A_j}{\rho_j} (\nabla W_h)(r_i - r_j) \neq 0.$$

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• For example $\psi = \rho$:

$$(\nabla A)(r_i) \approx \frac{1}{\rho_i} \sum_{i \in \mathcal{N}_i} m_j (A_j - A_i) (\nabla W_h) (r_i - r_j)$$



Navier-Stokes equation:

$$\rho \left(\partial_t \mathbf{v} + \mathbf{v} \cdot \nabla \mathbf{v} \right) = \rho \mathbf{g} - \nabla \mathbf{p} + \mu \Delta \mathbf{v}$$
, where

- v velocity
- g gravity
- p pressure
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will be trivially satisfied: each particle has constant mass and particles are neither created nor destroyed.

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• Consider the total derivate of v(r,t) with respect to time:

$$\frac{\mathrm{d}}{\mathrm{d}t}v(r,t)=(\partial_t v)(r,t)+[\dot{r}(t)]\cdot(\nabla v)(r,t)$$

It depends on \dot{r} , where r(t) is a *chosen* path in space.

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• Velocity v_i of particle moving with the fluid, i.e. $\dot{r}_i = v_i$:

$$\frac{\mathrm{d}}{\mathrm{d}t}\mathbf{v}_i = \partial_t \mathbf{v}_i + \mathbf{v}_i \cdot \nabla \mathbf{v}_i,$$

i.e. Navier-Stokes can be seen as Newton's second law in disguise.



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$$\frac{1}{\rho_i} (\nabla p)_i \approx \sum_{j \in \mathcal{N}_i} m_j \left(\frac{p_i}{\rho_i^2} + \frac{p_j}{\rho_j^2} \right) (\nabla W_h) (r_i - r_j)$$

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• Naive SPH-approximation of ∇p would yield

$$\begin{split} \frac{1}{\rho_i} \nabla [\mathbf{p}]_i &= \sum_{j \in \mathcal{N}_i} m_j \frac{p_j}{\rho_i \rho_j} (\nabla W_h) (r_i - r_j), \\ \Rightarrow F_{j \to i} &= m_i m_j \frac{p_j}{\rho_i \rho_i} (\nabla W_h) (r_i - r_j) \neq -F_{i \to j}. \end{split}$$

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• Using $\frac{1}{\rho} \nabla p = \nabla \left(\frac{p}{\rho} \right) + \frac{p}{\rho^2} \nabla \rho$ yields

$$\frac{1}{\rho_i} (\nabla p)_i \approx \nabla \left[\frac{p}{\rho} \right]_i + \frac{p_i}{\rho_i^2} \nabla [\rho]_i$$

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$$= \sum_{j \in \mathcal{N}_{i}} m_{j} \left(\frac{p_{i}}{\rho_{i}^{2}} + \frac{p_{j}}{\rho_{j}^{2}} \right) (\nabla W_{h})(r_{i} - r_{j})$$

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Viscosity term

• Naive SPH-approximation of Δv yields

$$\frac{\mu}{\rho_i} \Delta [\mathbf{v}]_i = \frac{\mu}{\rho_i} \sum_{j \in \mathcal{N}_i} m_j \frac{v_j}{\rho_j} (\Delta W_h) (r_i - r_j)$$

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$$\begin{split} \frac{\mu}{\rho_i} \left(\Delta v \right)_i &\approx \frac{\mu}{\rho_i} \left(\Delta [v]_i - v \Delta [\mathbf{1}]_i \right) \\ &= \frac{\mu}{\rho_i} \sum_{j \in \mathcal{N}_i} \frac{v_j - v_i}{\rho_j} (\Delta W_h) (r_i - r_j) \\ &\Rightarrow F_{j \to i} = \mu m_i m_j \frac{v_j - v_i}{\rho_i \rho_i} (\Delta W_h) (r_i - r_j) = -F_{i \to j}. \end{split}$$

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- N number of molecules
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, where

- N number of molecules
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- T (absolute) temperature
- k_B Boltzmann constant
- Modelled as

$$p_i = k(\rho_i - \rho_{eq})$$
, where

- *k* constant depending on temperature
- ρ_{eq} equilibrium density (set to zero for ideal gas)

Algorithm

For each timestep:

For each particle: compute density and pressure

$$\rho_i \leftarrow [\rho]_i = \sum_{j \in \mathcal{N}_i} m_j W_h(r_i - r_j)$$
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For each particle: integrate position and velocity with symplectic Euler scheme.



Boundary conditions

 Modelling of boundary conditions is an active area of research in SPH: the support of the kernel overlapping with boundaries leads to all sorts of problems.

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- Different types of boundaries:
 - Noslip-condition solid boundaries
 - Slip-condition solid boundaries
 - Mixtures of Slip/Noslip
 - Pressure boundaries
 - Flux boundaries
 - Reflective boundaries

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- Different types of boundaries:
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 - Pressure boundaries
 - Flux boundaries
 - Reflective boundaries
- Different methods to model boundaries:
 - Boundary particles
 - Ghost particles
 - Virtual forces
 - Analytical methods

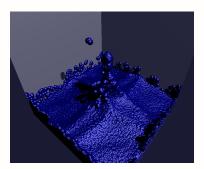
Advanced topics

Active areas of research in SPH include:

- Boundary modelling
- Adaptivity
- Surface tension
- Solid adhesion

Demo

- 64k particles, interactive frame-rates
- Graphics running against DirectX 11 (Windows only)
- Simulation running against OpenCL (Windows, Linux, Android, Supercomputers...)
- Surface tension and solid adhesion modelled according to Akinci, Akinci and Teschner (2013), Freiburg



Thanks for your attention!

Please do not hesitate to ask questions!