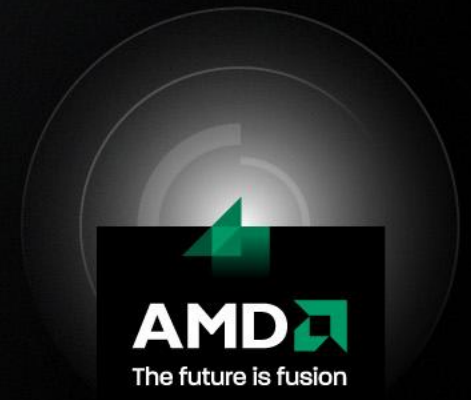


# Smoothed Particle Hydrodynamics

## Application Example

Alan Heirich | November 29, 2010



## Fluids

Navier-Stokes equations

Smoothed Particle Hydrodynamics

OpenCL simulation



# Fluids

- Liquids, e.g. water
- Gasses, e.g. air
- Plasmas



# Fluids

- Described by (incompressible) Navier-Stokes equations

$$\rho \left[ \frac{\partial \mathbf{v}}{\partial t} + \mathbf{v} \bullet \nabla \mathbf{v} \right] = \rho \mathbf{g} - \nabla p + \mu \nabla^2 \mathbf{v}$$

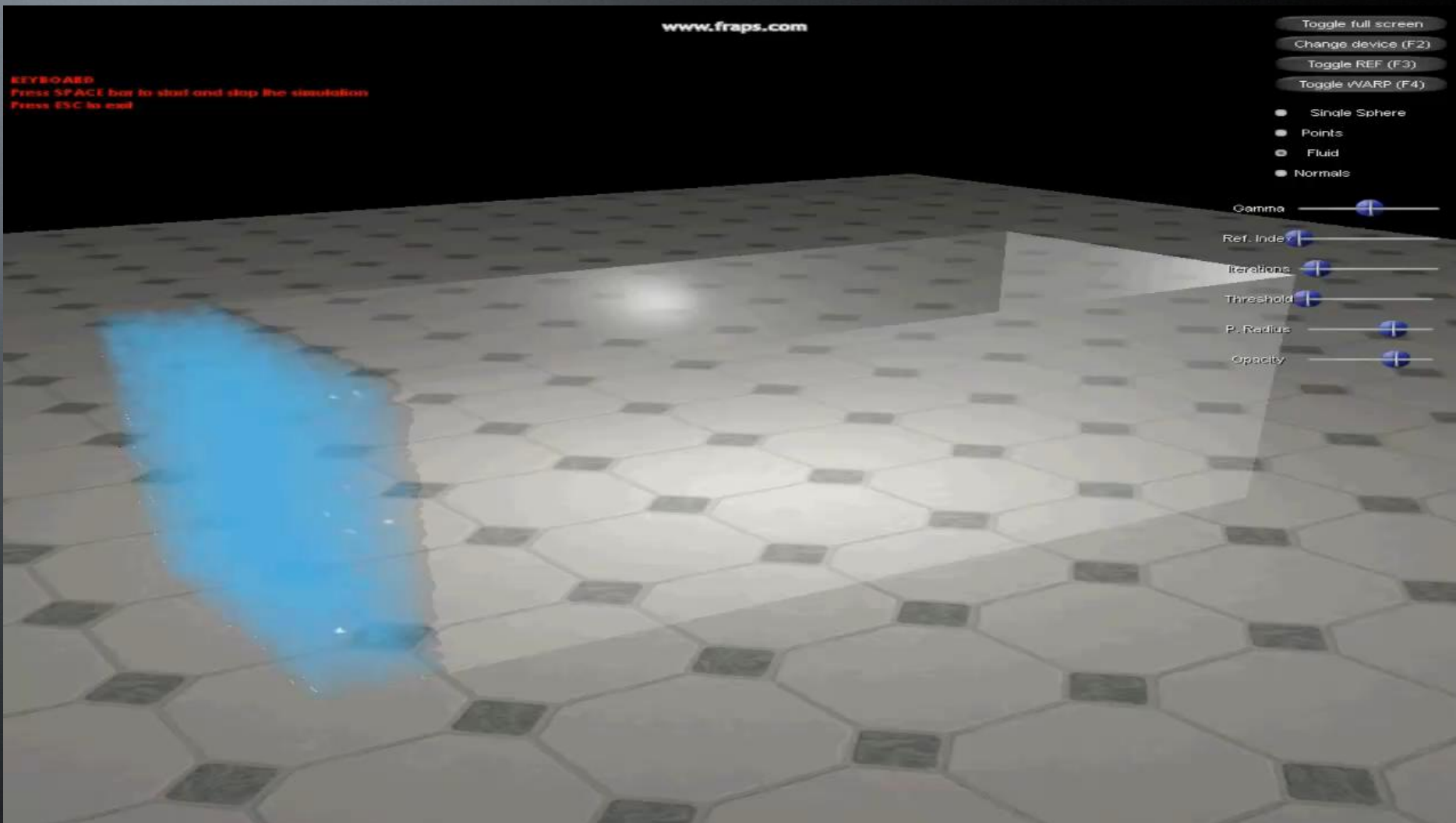
$$\rho(\nabla \bullet \mathbf{v}) = 0$$

- Driven by gravity  $\mathbf{g}$ , pressure  $\nabla p$  and velocity  $\mu \nabla^2 \mathbf{v}$ 
  - Fluid flows from high pressure to low pressure
  - Viscosity  $\mu$  determines fluid stickiness
    - Low viscosity: air, water
    - High viscosity: honey, mud





# Fluids



**Fluids**

**Navier-Stokes equations**

**Smoothed Particle Hydrodynamics**

**OpenCL simulation**



# Incompressible Navier-Stokes equations

$$\rho \left[ \frac{\partial \mathbf{v}}{\partial t} + \mathbf{v} \bullet \nabla \mathbf{v} \right] = \rho \mathbf{g} - \nabla p + \mu \nabla^2 \mathbf{v}$$

$$\rho (\nabla \bullet \mathbf{v}) = 0 \quad (\text{mass continuity})$$

- $\rho$  - density,  $p$  - pressure (scalars)
- $\mathbf{g}$  - gravity,  $\mathbf{v}$  - velocity (vectors)

$$\mathbf{v} \bullet \nabla \mathbf{v} \equiv \left[ v_x \frac{\partial v_x}{\partial x}, v_y \frac{\partial v_y}{\partial y}, v_z \frac{\partial v_z}{\partial z} \right] \quad \text{convective acceleration}$$

$$\nabla p \equiv \left[ \frac{\partial p}{\partial x}, \frac{\partial p}{\partial y}, \frac{\partial p}{\partial z} \right] \quad p = k(\rho - \rho_0) \quad \text{resting density } \rho_0$$

$$\nabla^2 \mathbf{v} \equiv [\nabla^2 v_x, \nabla^2 v_y, \nabla^2 v_z], \quad \nabla^2 v_x \equiv \frac{\partial^2 v_x}{\partial x^2} + \frac{\partial^2 v_x}{\partial y^2} + \frac{\partial^2 v_x}{\partial z^2}$$



# Incompressible Navier-Stokes equations

$$\rho \left[ \frac{\partial \mathbf{v}}{\partial t} + \mathbf{v} \bullet \nabla \mathbf{v} \right] = \rho \mathbf{g} - \nabla p + \mu \nabla^2 \mathbf{v}$$

– Mass continuity equation:  $\rho(\nabla \bullet \mathbf{v}) = 0$

$$\nabla \bullet \mathbf{v} = \left( \frac{\partial v_x}{\partial x} + \frac{\partial v_y}{\partial y} + \frac{\partial v_z}{\partial z} \right) = 0$$

– Mass continuity will be satisfied trivially by using a particle formulation, since each particle has constant mass and particles are neither created nor destroyed





# Incompressible Navier-Stokes equations

$$\rho \left[ \frac{\partial \mathbf{v}}{\partial t} + \mathbf{v} \bullet \nabla \mathbf{v} \right] = \rho \mathbf{g} - \nabla p + \mu \nabla^2 \mathbf{v}$$

- The material derivative is the derivative along a path with velocity  $\mathbf{v}$ . To simulate with particles take the material derivative

$$\rho \frac{D\mathbf{v}}{Dt} = \rho \mathbf{g} - \nabla p + \mu \nabla^2 \mathbf{v}$$

- For a single particle  $i$

$$\frac{dv_i}{dt} = \mathbf{g} - \frac{1}{\rho_i} \nabla p + \frac{\mu}{\rho_i} \nabla^2 \mathbf{v}$$



# Incompressible Navier-Stokes equations

- The Navier-Stokes equations are sensitive to scale, so we simulate them at 0.004x scale relative to the physical environment.



**Fluids**  
**Navier-Stokes equations**  
**Smoothed Particle Hydrodynamics**  
**OpenCL simulation**



# Smoothed Particle Hydrodynamics

- [Monaghan 1992] introduced smoothing kernels  $W$

$$A_i(r) = \int A(r')W(r-r',h)dr' \approx \sum_b A(r_b)W(r-r_b,h)$$

- And approximations to terms of the N-S equations

- $\rho_i \approx \sum_j m_j W(r-r_j,h)$   $m$  – mass,  $r$  – position,  $h$  – radius

$$\frac{\nabla p_i}{\rho_i} \approx \sum_j m_j \left( \frac{p_i}{\rho_i^2} + \frac{p_j}{\rho_j^2} \right) \nabla W(r-r_j,h)$$

$$\frac{\mu}{\rho_i} \nabla^2 v_i \approx \frac{\mu}{\rho_i} \sum_j m_j \left( \frac{v_j - v_i}{\rho_j} \right) \nabla^2 W(r-r_j,h)$$





# Smoothed Particle Hydrodynamics

- Over time the literature has converged on these  $W$ :
  - $w = 0$  at distance  $h$
  - $w$  sums to 1 over sphere of radius  $h$

$$W(r - r_b, h) \equiv \frac{315}{64\pi h^9} (h^2 - \|r - r_b\|^2)^3$$

$$\nabla W(r - r_b, h) \equiv \frac{-45}{\pi h^6} \left( h - \|r - r_b\| \right)^2 \frac{r - r_b}{\|r - r_b\|}$$

$$\nabla^2 W(r - r_b, h) \equiv \frac{45}{\pi h^6} \left( h - \|r - r_b\| \right)$$



# Smoothed Particle Hydrodynamics

- From Navier-Stokes to SPH:

$$\frac{dv_i}{dt} = g - \frac{1}{\rho_i} \nabla p + \frac{\mu}{\rho_i} \nabla^2 v \quad (1)$$

$$\rho_i \approx \sum_j m_j \frac{315}{64\pi h^9} (h^2 - \|r - r_b\|^2)^3 \quad (2)$$

$$\frac{\nabla p_i}{\rho_i} \approx \sum_j m_j \left( \frac{p_i}{\rho_i^2} + \frac{p_j}{\rho_j^2} \right) \frac{-45}{\pi h^6} \left( h - \|r - r_b\| \right)^2 \frac{r - r_b}{\|r - r_b\|} \quad (3)$$

$$\frac{\mu}{\rho_i} \nabla^2 v_i \approx \frac{\mu}{\rho_i} \sum_j m_j \left( \frac{v_j - v_i}{\rho_j} \right) \frac{45}{\pi h^6} \left( h - \|r - r_b\| \right) \quad (4)$$



**Fluids**  
**Navier-Stokes equations**  
**Smoothed Particle Hydrodynamics**  
**OpenCL simulation**



# OpenCL simulation

- Numerical algorithm:
  - density  $\rho$  = equation (2).
  - pressure  $p = k(\rho - \rho_0)$
  - pressure gradient  $\frac{\nabla p_i}{\rho_i}$  = equation (3).
  - viscous term  $\frac{\mu}{\rho_i} \nabla^2 v_i$  = equation (4).
  - acceleration = equation (1).
  - numerically integrate velocity, position.





# OpenCL simulation

- A naïve algorithm computes interactions among all particles
  - Gives correct result because  $W = 0$  for particles beyond the interaction radius
  - But this has complexity  $O(n^2)$ 
    - Need an algorithm that only computes interactions among particles that are within the interaction radius



# OpenCL simulation

- A better algorithm partitions space into local regions
  - Divide into voxels of size  $2h$  on a side
  - Each particle can only interact with particles in the same voxel, and in immediately adjacent voxels
    - Total search volume =  $2 \times 2 \times 2$  voxels
  - Further refinement: compute interactions with a limited number  $m$  of particles
    - $m = 32$  works well



# OpenCL simulation

- The final algorithm:
  - Organize particles into voxels
  - Compute spatial index from voxel to particles
  - For every particle
    - Examine local region of 2x2x2 voxels
    - Compute interactions with 32 particles



# OpenCL simulation

- Interop allows a buffer to be shared between OpenCL and a graphics subsystem.
  - This avoids an expensive round trip to host memory
  - This is crucial for high performance applications
- Due to limits of time we did not implement interop in the graphics code, however we will show you the OpenCL initialization for interop for reference.





# OpenCL simulation

- To interop with dx10 include "cl\_d3d10.h" and define USE\_DX\_INTEROP

```
#define USE_DX_INTEROP
#if defined(__APPLE__) || defined(__MACOSX)
#include <OpenCL/cl.hpp>
#include <OpenCL/cl_d3d10.h>
#else
#include <CL/cl.hpp>
#include <CL/cl_d3d10.h>
#endif
```



# OpenCL simulation

- To interop with dx10 initialize the OpenCL context:

```
cl_context_properties *cprops;  
cprops = new cl_context_properties[ 6 ];  
cprops[ 0 ] = CL_CONTEXT_D3D10_DEVICE_KHR;  
cprops[ 1 ] = (intptr_t) DXUTGetD3D10Device();  
cprops[ 2 ] = CL_CONTEXT_PLATFORM;  
cprops[ 3 ] = (cl_context_properties)(platformList[0])();  
cprops[ 4 ] = cprops[ 5 ] = 0;  
context = cl::Context( CL_DEVICE_TYPE_GPU, cprops, NULL, NULL,  
&err);
```



# OpenCL simulation

- Buffers
  - position, velocity, acceleration – float4
  - particleIndex – uint2
  - sortedPosition, sortedVelocity – float4
  - gridCellIndex, gridCellIndexFixedUp – uint
- Kernels
  - hashParticles, sort, sortPostPass
  - indexx, indexPostPass
  - findNeighbors
  - computeDensityPressure, computeAcceleration, integrate



# OpenCL simulation

- The final algorithm:
  - Organize particles into voxels
    - hashParticles, sort, sortPostPass
  - Compute spatial index from voxel to particles
    - indexx, indexPostPass
  - For every particle
    - Examine local region of 2x2x2 voxels
      - findNeighbors
    - Compute interactions with 32 particles
      - computeDensityPressure, computeAcceleration, integrate





# OpenCL simulation

- Organize particles into voxels: `global_id(0)=particle id`
  - hashParticles:
    - computes a scalar voxel id from position
      - Voxel size  $2h \times 2h$
    - stores voxel id in `position.w`;
    - writes `{voxel id, global_id(0)}` to `particleIndex`
  - sort:
    - sorts `particleIndex` by voxel id
      - radixSort works only on GPU, use qsort on CPU
  - sortPostPass:
    - rewrite `position, velocity` into `sortedPosition, sortedVelocity` according to order of `particleIndex`



# OpenCL simulation

- Compute spatial index from voxel to particles:  
global\_id(0) = voxel id
  - indexx:
    - computes gridCellIndex(i), index into sortedPosition of first particle in voxel i
      - Binary search in sortedPosition for lowest particle id
        - Leave -1 for empty voxels
  - indexPostPass:
    - Fills in index for empty voxels
      - gridCellIndex( i ) = gridCellIndex( i+1 ) for i empty, i+1 nonempty



# OpenCL simulation

- Examine local region of 2x2x2 voxels:
  - findNeighbors:
    - Locates particle in one corner of 2x2x2 voxel set
    - Searches up to 8 voxels until 32 neighbors are found
      - Retains only neighbors within interaction radius
      - Within each voxel search is randomized
        - Necessary to eliminate biasing artifacts
        - Specifically, compute random offset within voxel, then proceed sequentially
        - Alternate sequential directions according to odd/evenness of particle





# OpenCL simulation

- Compute interactions with 32 particles:
  - computeDensityPressure:
    - Equation (2) followed by  $p = k(\rho - \rho_0)$
  - computeAcceleration:
    - Equations (3), (4), (1)
  - integrate:
    - Semi-implicit Euler integration
    - $v = v + dt a$ , position = position + dt v
      - Boundary conditions prevent particle escape





# Summary

- Fluids
  - Governed by pressure, velocity
- Navier-Stokes equations
  - Incompressible equations, material derivative
- Smoothed Particle Hydrodynamics
  - Smoothing kernel approximations
  - Approximate  $\rho$ ,  $\nabla p$ ,  $\nabla^2 v$
- OpenCL simulation
  - Organize into voxels, create voxel index, compute equations (2), (3), (4), (1), integrate



# Questions and Answers

**Visit the OpenCL Zone on developer.amd.com**

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  - Slide decks of this and past webinars
  - Source code for Smoothed Particle Hydrodynamics webinar



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